

# LARGE-SCALE STRUCTURE NON-GAUSSIANITIES WITH MODAL METHODS

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Collaborators

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Berkeley 22 Oct 2013



# OVERVIEW

- Deviations from Gaussianity: Motivation
- Theoretical expectations
- Non-Gaussian initial conditions
- Estimating non-Gaussianity
- Simulation results

Part II: CMB lensing



# NON-GAUSSIANITY FROM INFLATION

- Vacuum expectation value of a quantum field perturbation  $\delta\varphi$  with inflationary Lagrangian  $\mathcal{L}$

$$\langle\Omega|\delta\varphi_{\mathbf{k}_1}\cdots\delta\varphi_{\mathbf{k}_n}|\Omega\rangle = \frac{\int \mathcal{D}[\delta\varphi]\delta\varphi_{\mathbf{k}_1}\cdots\delta\varphi_{\mathbf{k}_n}\exp(i\int_C\mathcal{L}(\delta\varphi_{\mathbf{k}}))}{\int \mathcal{D}[\delta\varphi]\exp(i\int_C\mathcal{L}(\delta\varphi_{\mathbf{k}}))}$$

- *Free* theory  $\mathcal{L} \sim \delta\varphi^2 \Rightarrow e^{i\int_C\mathcal{L}}$  is *Gaussian*

$$\langle\Omega|\delta\varphi_{\mathbf{k}_1}\cdots\delta\varphi_{\mathbf{k}_n}|\Omega\rangle = \begin{cases} \text{determined by 2-point function,} & n \text{ even,} \\ 0, & n \text{ odd.} \end{cases}$$

- *Interacting* theory  $\mathcal{L} \sim \delta\varphi^3, \delta\varphi^4, \dots \Rightarrow e^{i\int_C\mathcal{L}}$  is *non-Gaussian*

$\langle\Omega|\delta\varphi_{\mathbf{k}_1}\cdots\delta\varphi_{\mathbf{k}_n}|\Omega\rangle \neq 0$  possible for all  $n$ ,  $\mathbf{k}$ -dependence characterises interactions

⇒ Inflationary interactions are mapped to specific types of non-Gaussianity



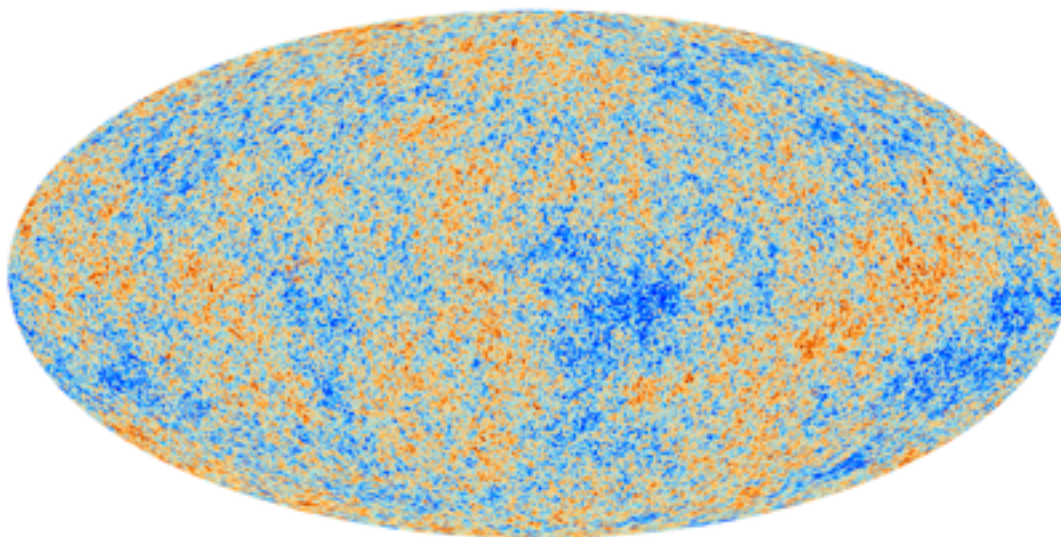
# NON-GAUSSIANITY FROM INFLATION

As the universe expands, quantum fluctuations become classical perturbations  $\Phi$ , whose probability density  $\text{Pr}[\Phi]$  is determined by the inflationary Lagrangian  $\mathcal{L}$

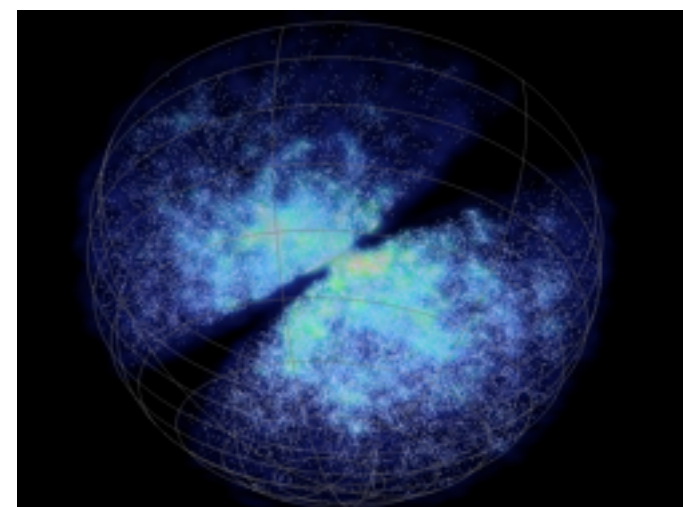
$$\langle \Phi_{\mathbf{k}_1} \cdots \Phi_{\mathbf{k}_n} \rangle = \int \mathcal{D}[\Phi] \Phi_{\mathbf{k}_1} \cdots \Phi_{\mathbf{k}_n} \text{Pr}[\Phi]$$

Bardeen potential in MDU,  $\Phi = -3\mathcal{R}/5$

Constrain inflation by measuring these correlation functions in observations



Planck



6df galaxy survey



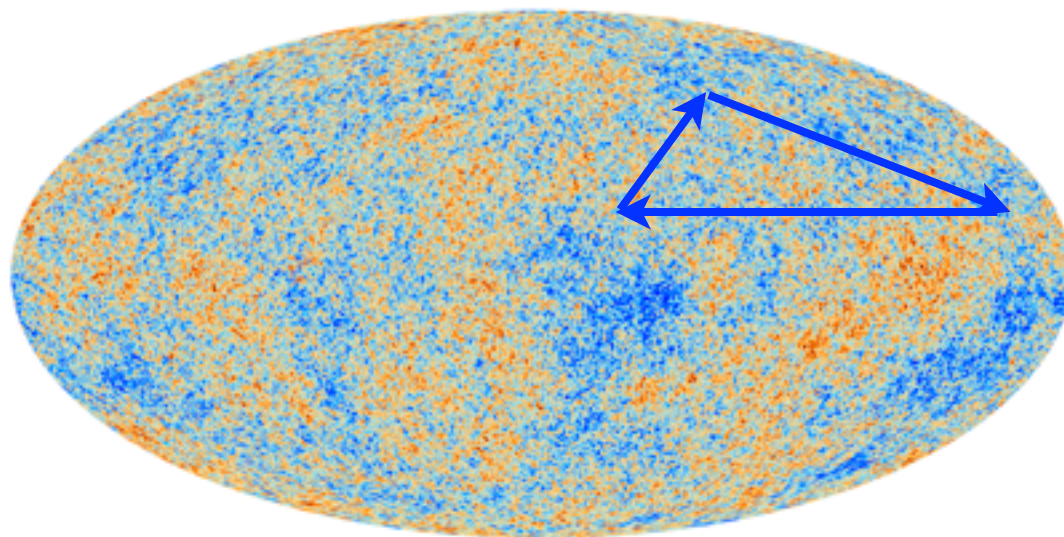
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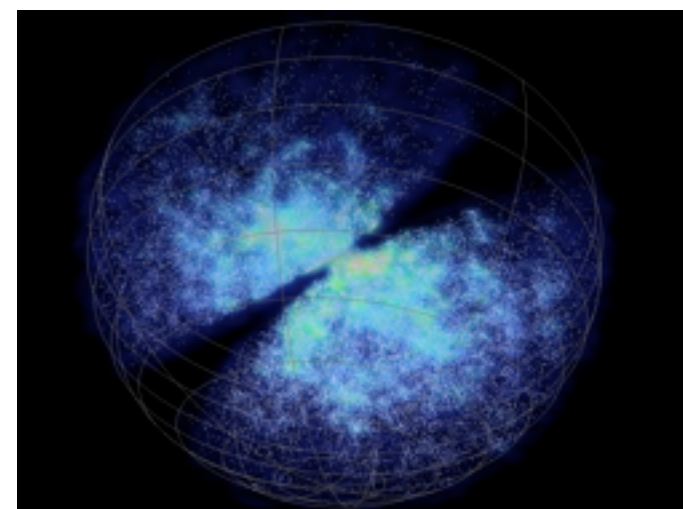
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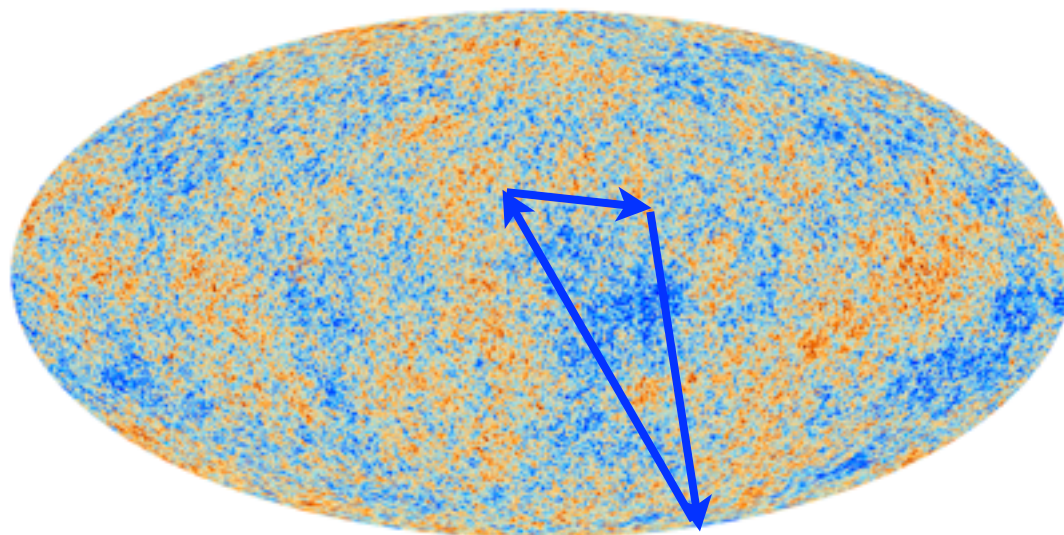
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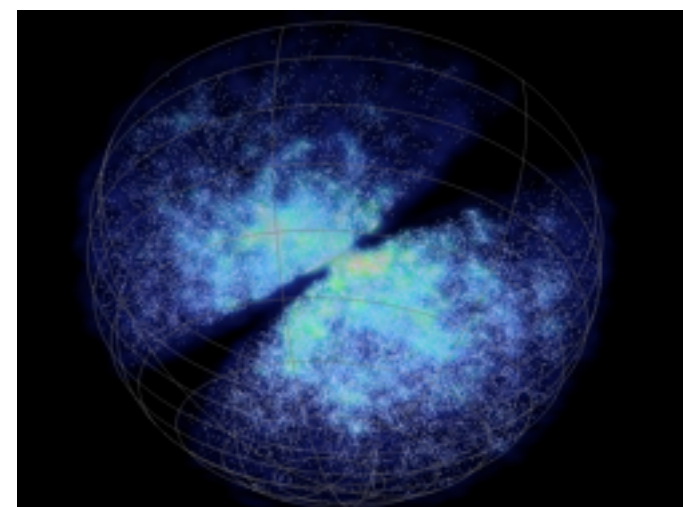
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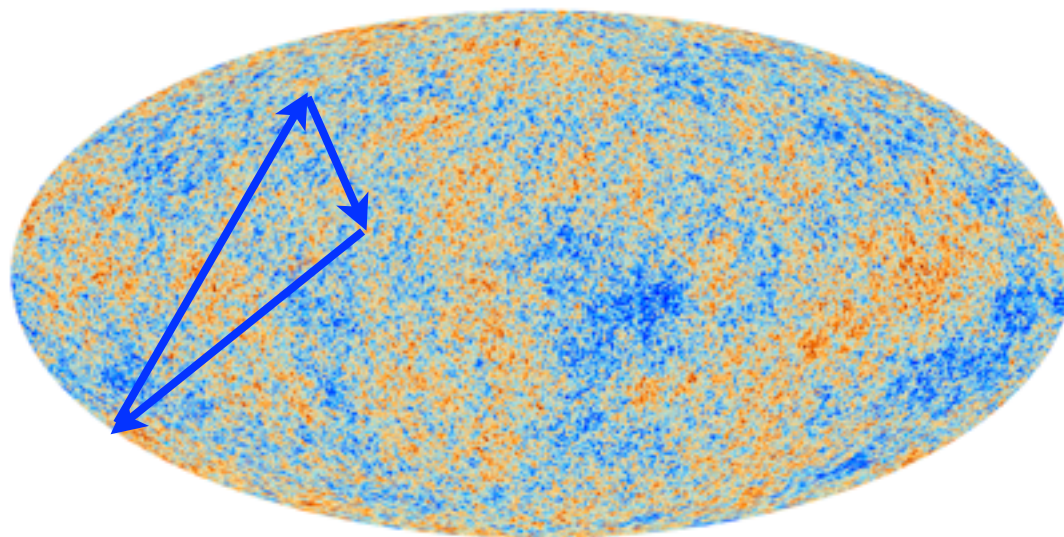
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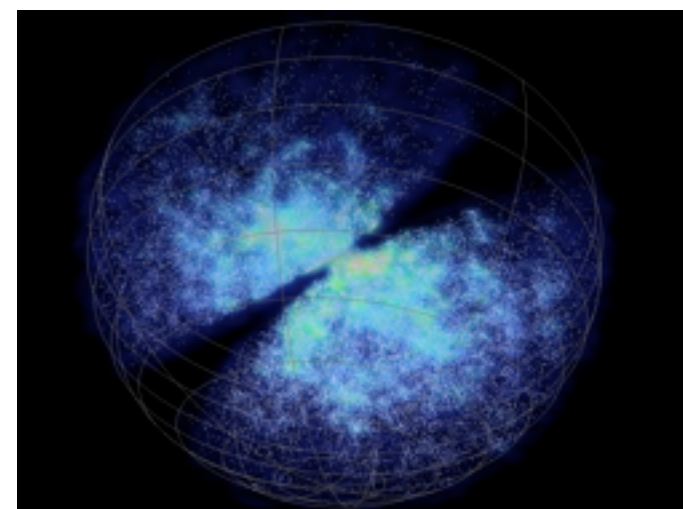
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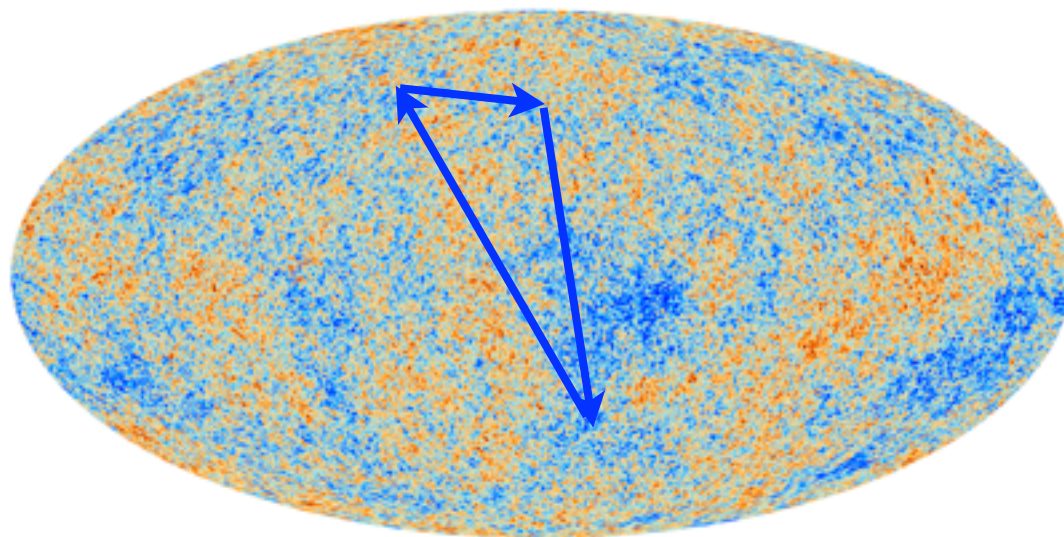
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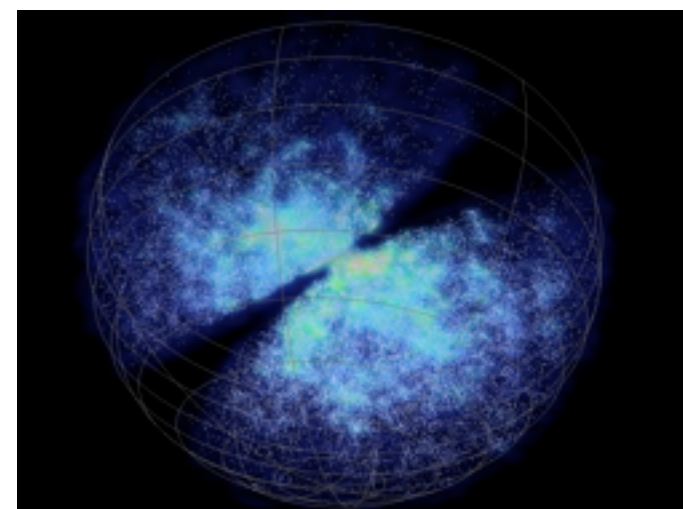
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Constrain inflation by measuring these correlation functions in observations



Planck



6df galaxy survey



# NON-GAUSSIANITY FROM INFLATION

As the universe expands, quantum fluctuations become classical perturbations  $\Phi$ , whose probability  $P_{\mathcal{R}}[\Phi]$  is determined by the initial conditions.

de Sitter potential in  
de Sitter space,  $\Phi = -3\mathcal{R}/5$

Constraints from  
observations

Primordial non-Gaussianity =  
Accelerator in the sky  
(reaching energy scale of inflation)

Planck

6df galaxy survey

# NON-GAUSSIANITY FROM INFLATION



► *Why measure in large-scale structures?*

## Advantages:

- LSS = most promising window for non-Gaussianity after Planck
- In principle more information than CMB because 3D
- Lots of data available or coming up (e.g. BOSS, DES, Euclid, LSST, WFIRST, SKA, ...)
- Single field inflation can be ruled out with halo bias (high sensitivity to squeezed limit of the bispectrum)

## Complications:

- Non-linear gravity produces late time non-Gaussianity
- Non-linear evolution of primordial input non-Gaussianity
- Difficult modeling and data analysis
- Observational issues: Halo bias, redshifts space distortions, survey geometry, ...



# NON-GAUSSIANITY FROM GRAVITY

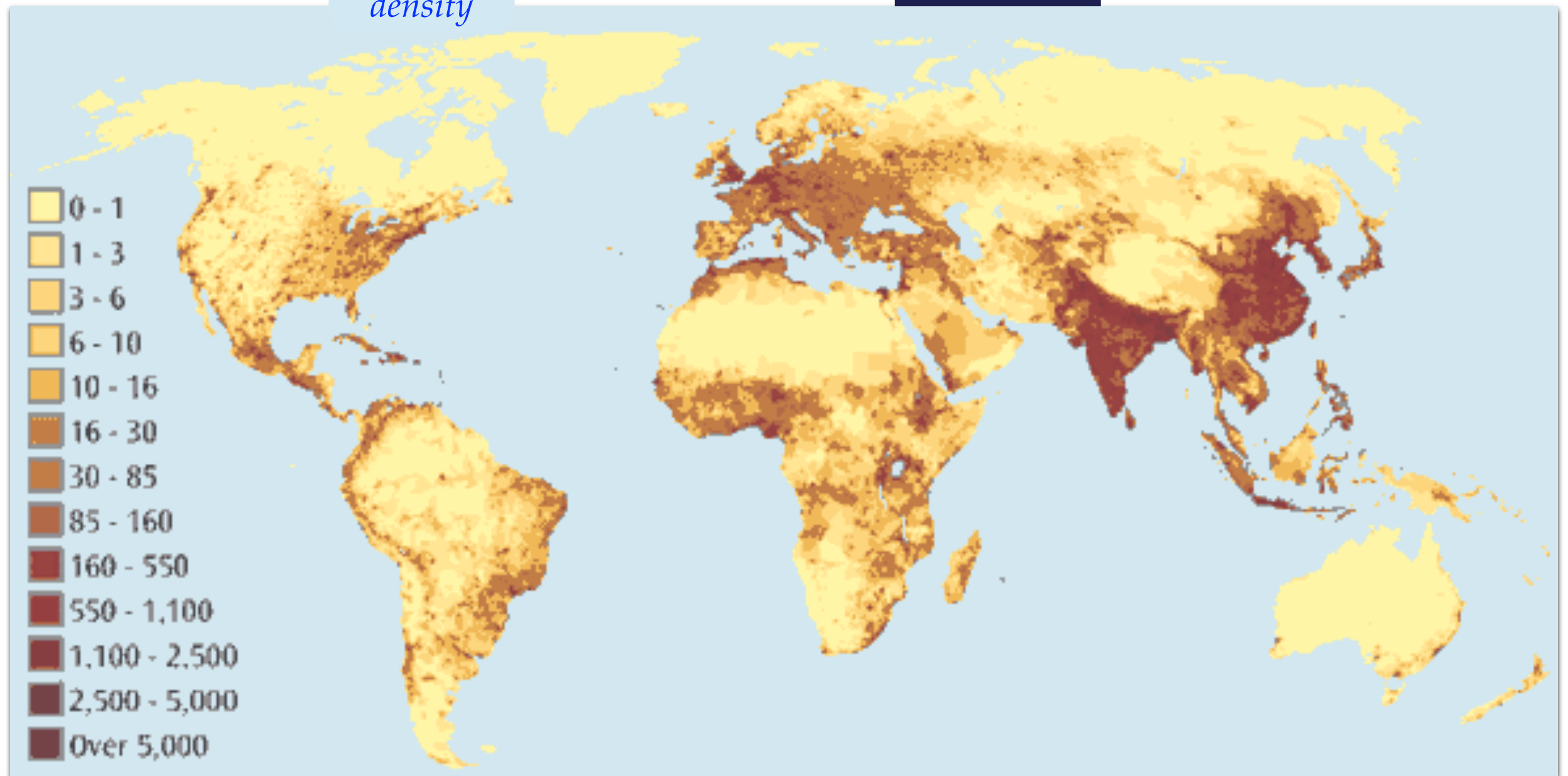
- ▶ Even in a (boring) Gaussian universe, non-Gaussianity from gravity is interesting
  - Distribution of **dark matter** is different from that of **galaxies**      ⇒ “Galaxy bias”



# NON-GAUSSIANITY FROM GRAVITY

► Even in a (boring) Gaussian universe, non-Gaussianity from gravity is interesting

- Distribution of *human population density* is different from that of *night light* → “Galaxy bias”

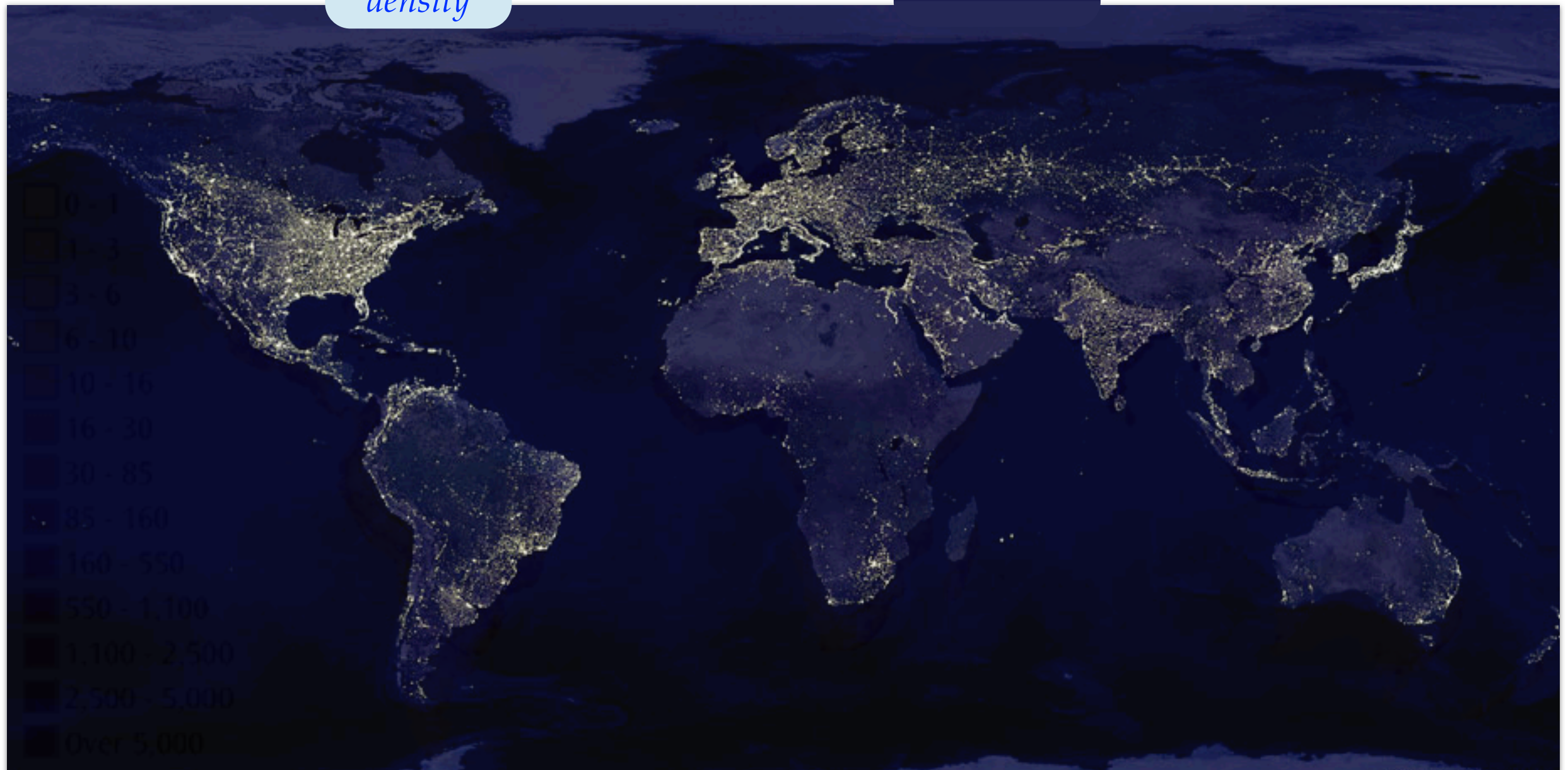




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# NON-GAUSSIANITY FROM GRAVITY

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- Distribution of **dark matter** is different from that of **galaxies**      ⇒ “Galaxy bias”

Simplest ansatz:

$$\delta_g(\mathbf{x}) \sim b_1 \delta(\mathbf{x}) + \frac{1}{2} b_2 \delta(\mathbf{x})^2 + \dots$$

3-point function pins down bias model & parameters ( $b_1, b_2, \dots$ ),  
which is required to do cosmology with LSS data

- Break degeneracies of systematic effects or cosmological parameters that are present at the power spectrum (2-point) level
  - ⇒ Improve cosmological parameter constraints



# NON-GAUSSIANITY FROM GRAVITY

► *Late-time* motivation for LSS non-Gaussianity:

From (naive)  $\delta_g(\mathbf{x}) \sim b_1 \delta(\mathbf{x}) + \frac{1}{2} b_2 \delta(\mathbf{x})^2 + \dots$  we get

$\delta$ : DM density  
 $\delta_g$ : galaxy density  
 $b_1$ : linear bias  
 $b_2$ : quadratic bias

## Galaxy power spectrum (2-point)

$$P_g(k) \approx b_1^2 P_\delta(k)$$

- Cannot distinguish rescaling of  $P_\delta$  from  $b_1$   
     $\Rightarrow b_1$ - $\Omega_m$  degeneracy

## Galaxy bispectrum (3-point)

$$B_g(k_1, k_2, k_3) \approx b_1^3 B_\delta(k_1, k_2, k_3) + b_1^2 b_2 (P_\delta(k_1) P_\delta(k_2) + \text{perms})$$

- Break  $b_1$ - $\Omega_m$  degeneracy, i.e. can **measure  $\Omega_m$  from LSS alone**
- Measure  $b_2$

Fry 1994  
Verde *et al.* 1997-2002  
Scoccimarro *et al.* 1998  
Sefusatti *et al.* 2006

But: No large-scale structure non-Gaussianity (bispectrum) pipeline

Complicated modeling (non-linear DM, bias, RSD, correlations, survey geometry, ...)



# 3-POINT CORRELATIONS (BISPECTRUM)



# POWER SPECTRUM + BISPECTRUM

- 2-point function:

*power spectrum*  $P_\Phi$

$$\langle \Phi(\mathbf{k}_1) \Phi(\mathbf{k}_2) \rangle = (2\pi)^3 \delta_D(\mathbf{k}_1 + \mathbf{k}_2) P_\Phi(k_1)$$

statistical isotropy

statistical homogeneity

# POWER SPECTRUM + BISPECTRUM

- 2-point function:

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statistical isotropy

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- 3-point function:

$$\langle \Phi(\mathbf{k}_1)\Phi(\mathbf{k}_2)\Phi(\mathbf{k}_3) \rangle = (2\pi)^3 \delta_D(\mathbf{k}_1 + \mathbf{k}_2 + \mathbf{k}_3) f_{\text{NL}} B_\Phi(k_1, k_2, k_3)$$

statistical isotropy

*non-linear  
amplitude*  $f_{\text{NL}}$

*bispectrum*  $B_\Phi$

**primary diagnostic for non-Gaussianity** (vanishes for Gaussian  $\Phi$ )



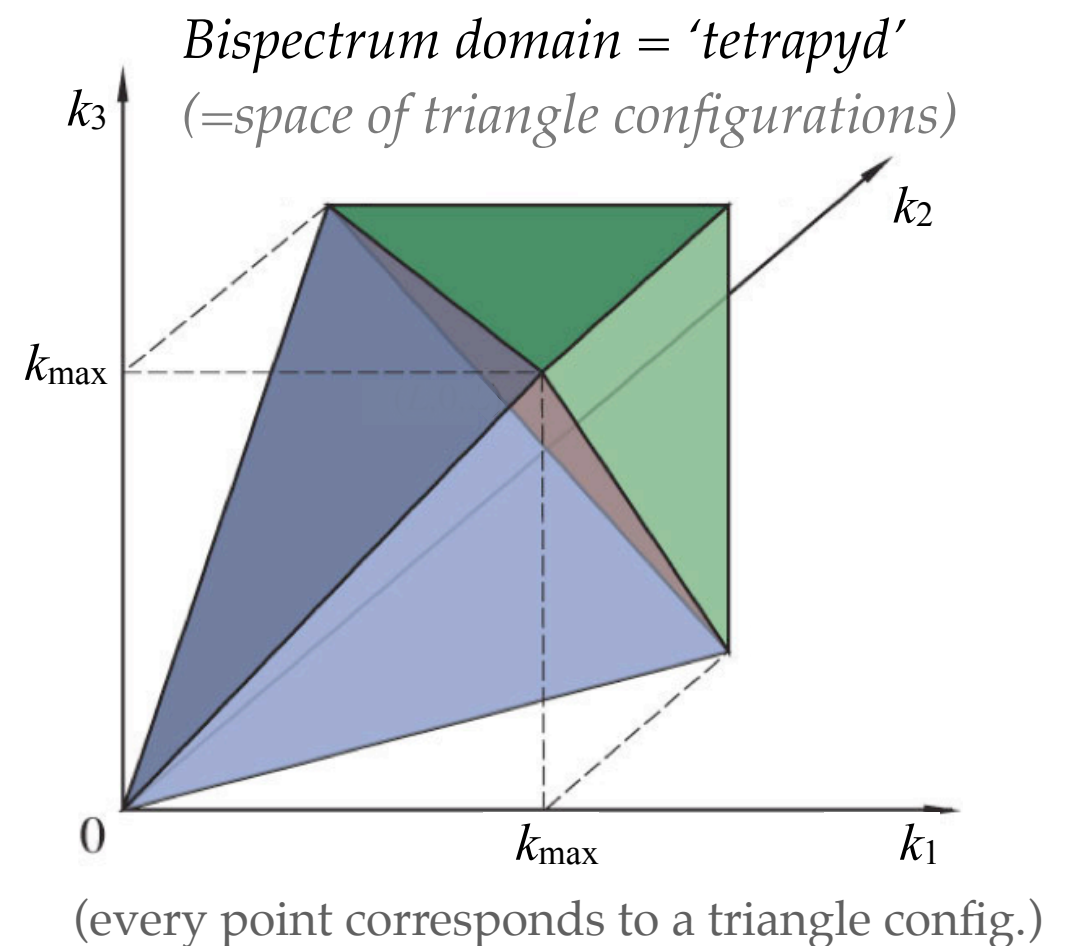
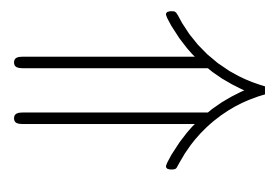
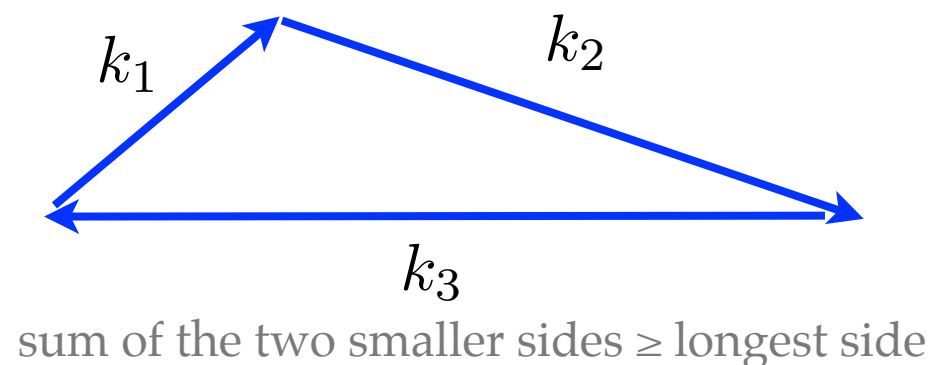
# BISPECTRUM

## ► Bispectrum (3-point correlation function in Fourier space)

- Defined for closed triangles (statistical homogeneity and isotropy)

$$\langle \Phi(\mathbf{k}_1)\Phi(\mathbf{k}_2)\Phi(\mathbf{k}_3) \rangle = (2\pi)^3 \delta_D(\mathbf{k}_1 + \mathbf{k}_2 + \mathbf{k}_3) f_{\text{NL}} B_{\Phi}(k_1, k_2, k_3)$$

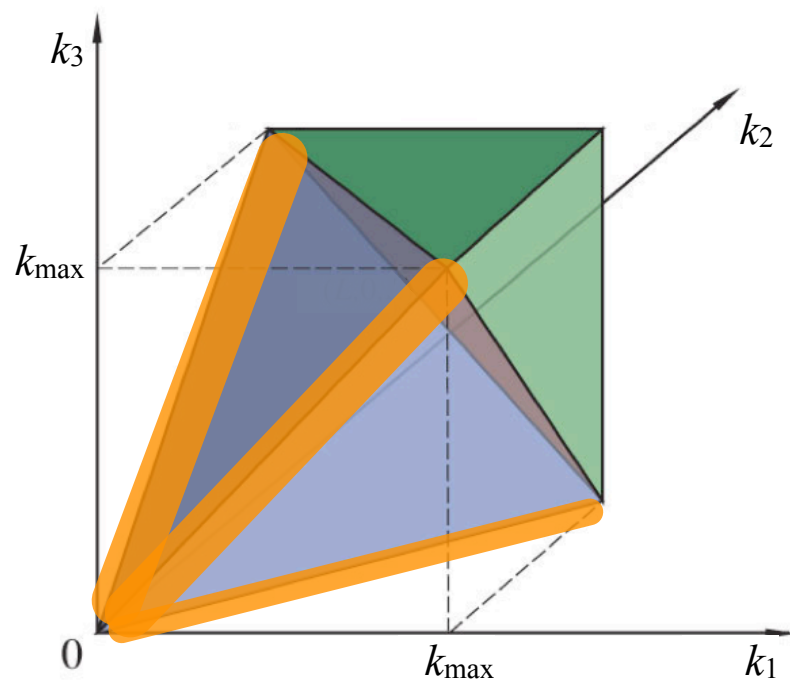
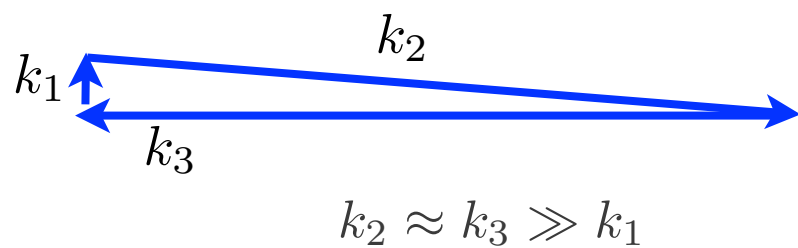
non-linear  
amplitude  
bispectrum



# BISPECTRUM SHAPES

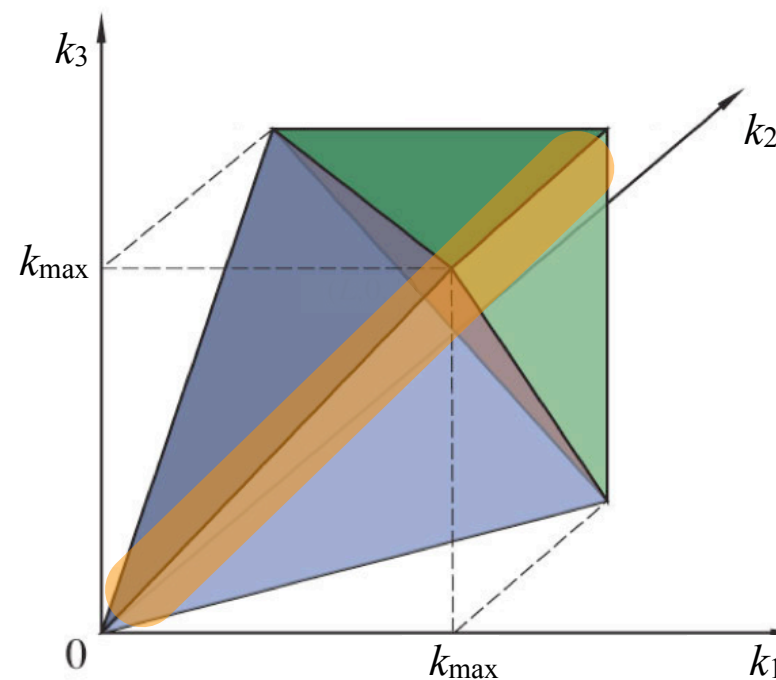
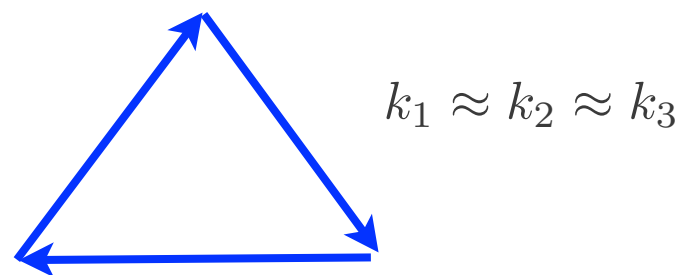
Different inflation models induce different momentum dependencies (shapes) of  $B_{\Phi}(k_1, k_2, k_3)$

## *Squeezed* triangles (local shape)



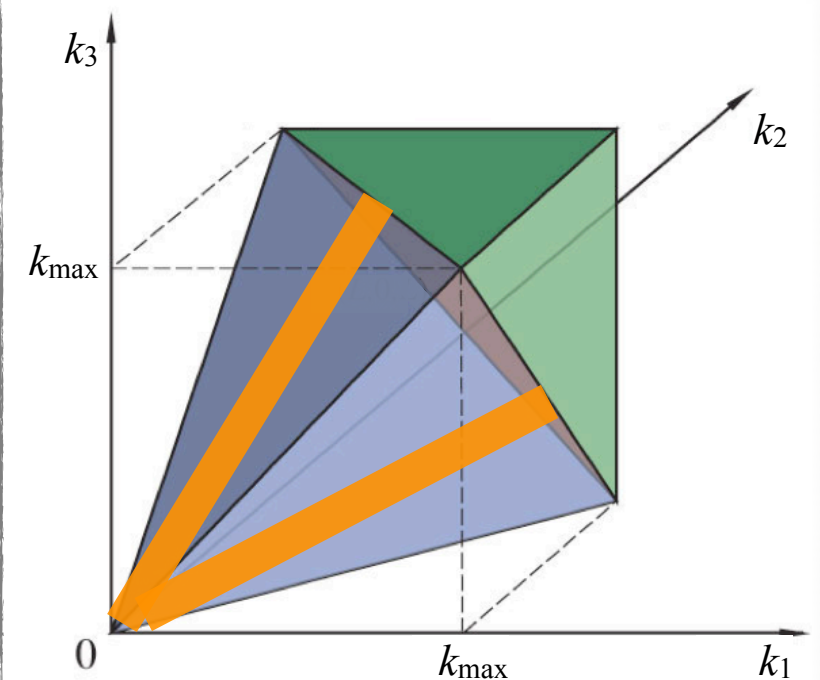
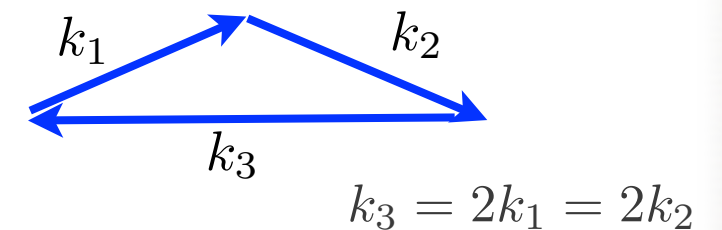
Arises in multifield inflation;  
detection would rule out all  
single field models!

## *Equilateral* triangles



Typically higher derivative  
kinetic terms, e.g. DBI inflation

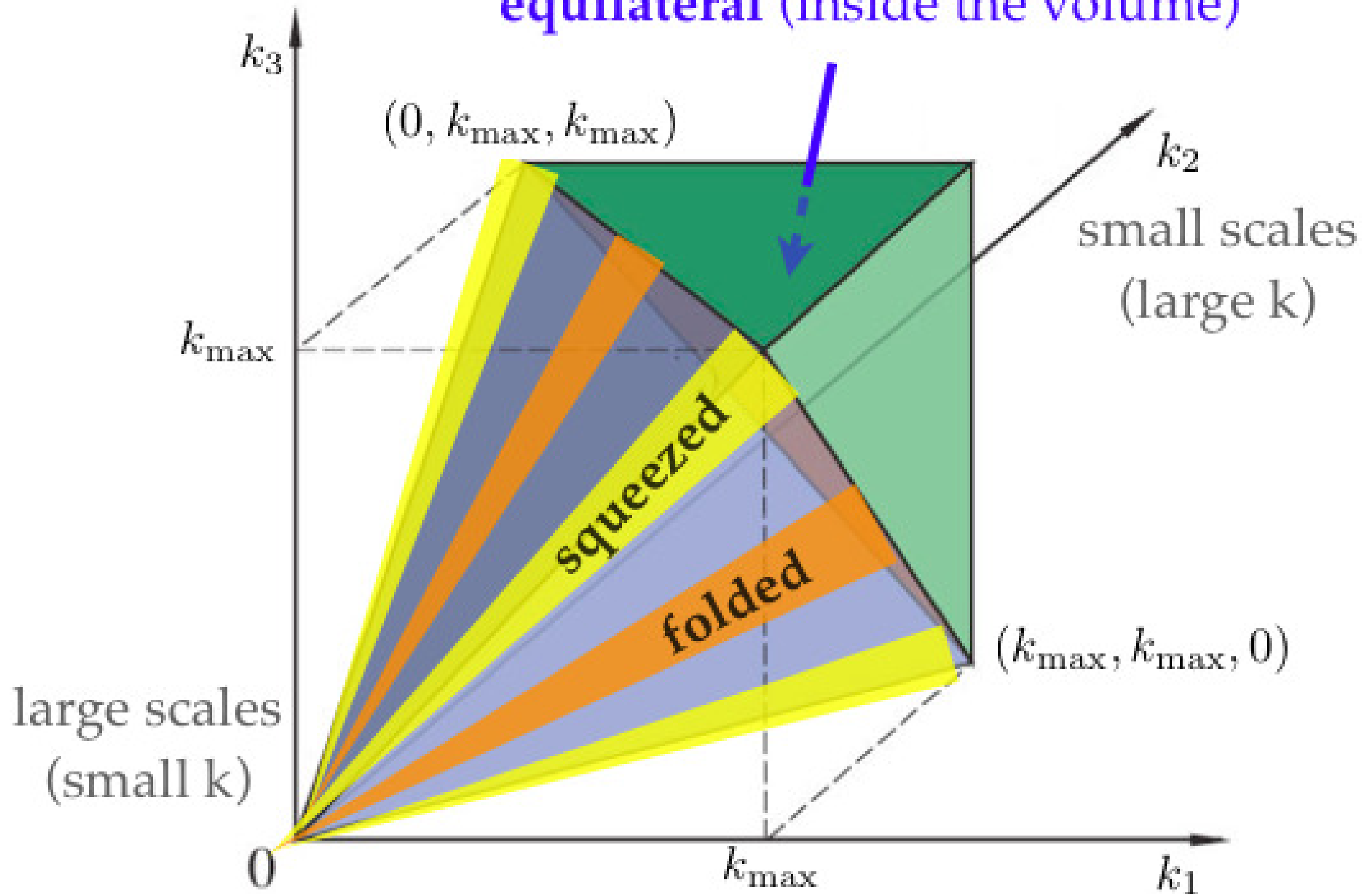
## *Folded* triangles



E.g. non-Bunch-Davies vacuum



equilateral (inside the volume)



*bispectrum drawn on space of  
triangle configurations*



# NON-GAUSSIANITY IN LARGE SCALE STRUCTURES



# NG IN LSS

$$B_{\delta} = B_{\delta}^{\text{grav}} + B_{\delta}^{\text{prim}}$$

full matter                      gravitational                      primordial  
bispectrum

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$$B_{\delta} = B_{\delta}^{\text{grav}} + B_{\delta}^{\text{prim}}$$

full matter                      gravitational                      primordial  
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# GRAVITATIONAL NG

Use perturbation theory on large scales:

e.g. Bernardeau,  
Colombi, Gaztanaga,  
Scoccimarro 2002

$$\delta(\mathbf{k}, t) = \sum_{n=1}^{\infty} D(t)^n \delta_n(\mathbf{k})$$

$$\delta_n(\mathbf{k}) = \int d^3\mathbf{q}_1 \cdots \int d^3\mathbf{q}_n \delta_D(\mathbf{k} - \mathbf{q}_1 - \cdots - \mathbf{q}_n) F_n^{(s)}(\mathbf{q}_1, \dots, \mathbf{q}_n) \delta_1(\mathbf{q}_1) \cdots \delta_1(\mathbf{q}_n)$$

where

$D(t)$  = linear growth factor      ( $= a(t)$  during matter domination)

$F_n^{(s)}$  = kernels determined by Newtonian equations of motion

# GRAVITATIONAL NG

For Gaussian initial conditions (Gaussian  $\delta_1$ ) the leading order bispectrum from gravity is

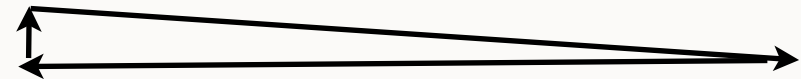
$$\langle \delta(\mathbf{k}_1, t) \delta(\mathbf{k}_2, t) \delta(\mathbf{k}_3, t) \rangle = D^4(t) \langle \delta_1(\mathbf{k}_1) \delta_1(\mathbf{k}_2) \delta_2(\mathbf{k}_3) \rangle + 2 \text{ perms}$$

$$\Rightarrow B_{\delta}^{\text{grav}}(k_1, k_2, k_3) = 2P_{\delta}(k_1; t)P_{\delta}(k_2; t)F_2^{(s)}(\mathbf{k}_1, \mathbf{k}_2) + 2 \text{ perms}$$

$$F_2^{(s)}(\mathbf{k}_1, \mathbf{k}_2) = \frac{10}{14} + \frac{1}{2} \frac{\mathbf{k}_1 \cdot \mathbf{k}_2}{k_1 k_2} \left( \frac{k_1}{k_2} + \frac{k_2}{k_1} \right) + \frac{2}{7} \left( \frac{\mathbf{k}_1 \cdot \mathbf{k}_2}{k_1 k_2} \right)^2$$

from  $\nabla \delta \cdot \mathbf{v}$  in continuity eqn.      from  $(\mathbf{v} \cdot \nabla) \mathbf{v}$  in Euler eqn.

maximum for  $\mathbf{k}_1 = \mathbf{k}_2$  (folded), 0 for  $\mathbf{k}_1 = -\mathbf{k}_2$  (squeezed)



$$P_{\delta}(k_1; t) \equiv (2\pi)^3 \delta_D(\mathbf{k}_1 + \mathbf{k}_2) D^2(t) \langle \delta_1(\mathbf{k}_1) \delta_1(\mathbf{k}_2) \rangle$$

$$\mathbf{k}_1 \cdot \mathbf{k}_2 = \frac{1}{2}(k_3^2 - k_1^2 - k_2^2)$$



# NG IN LSS

$$B_{\delta} = B_{\delta}^{\text{grav}} + B_{\delta}^{\text{prim}}$$

full matter  
bispectrum

gravitational

primordial

# PRIMORDIAL NG

Relation to density perturbation with Poisson equation (in linear theory):

linear matter transfer function  
(=1 on very large scales)

linear growth function  
(=  $a(t)$  during matter domination)

$$\delta(\mathbf{k}, t) = \frac{2}{3} \frac{c^2 k^2 T(k) D(t)}{\Omega_m H_0^2} \Phi(\mathbf{k}) \equiv M(k, t) \Phi(\mathbf{k})$$

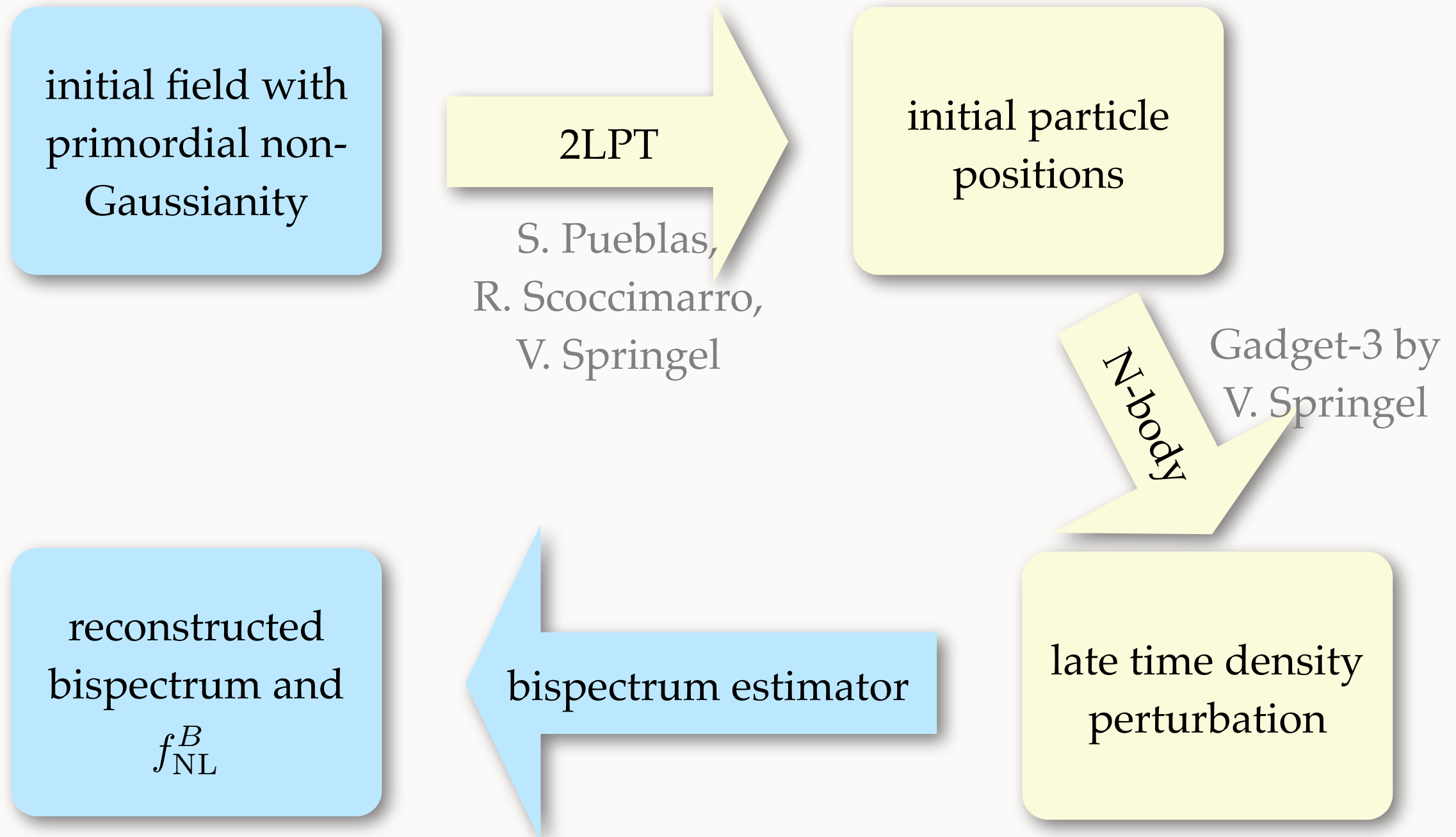
$$\Rightarrow B_{\delta}^{\text{prim}}(k_1, k_2, k_3; t) = \underbrace{M(k_1, t)}_{\text{late time}} \underbrace{M(k_2, t)}_{\text{linear transfer}} \underbrace{M(k_3, t)}_{\text{primordial}} F_{\text{NL}} B_{\Phi}(k_1, k_2, k_3)$$

time dependence:  $B_{\delta}^{\text{prim}} \propto D^3(t), \quad B_{\delta}^{\text{grav}} \propto D^4(t)$

► easier to see primordial contribution at earlier times (high  $z$ )

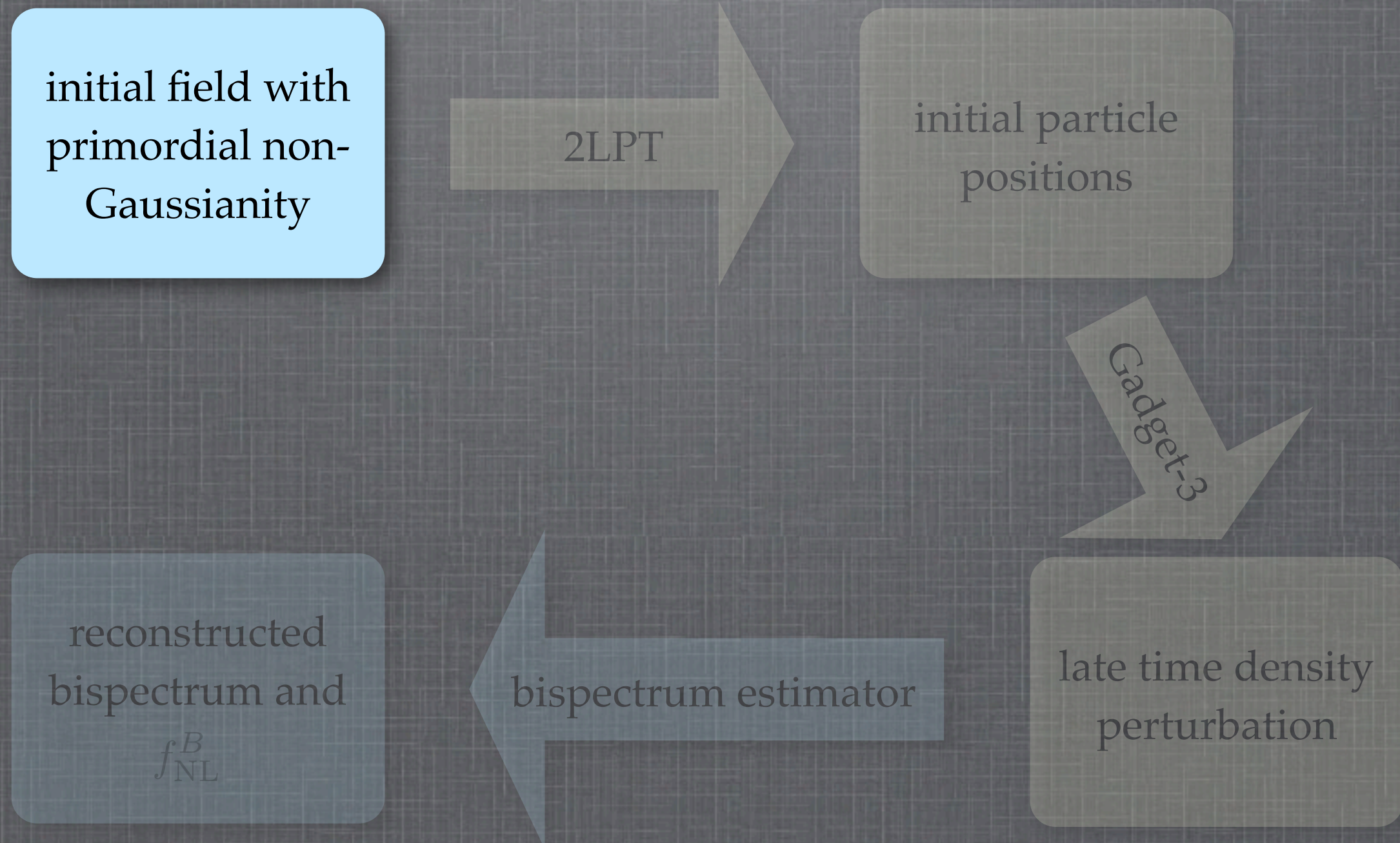


# SIMULATION SETUP





# INITIAL CONDITIONS





# INITIAL CONDITIONS: MATHS

Aim: Create non-Gaussian field

$$\begin{array}{ccccccc} \Phi(\mathbf{x}) & = & \Phi_G(\mathbf{x}) & + & \Phi_{NG}(\mathbf{x}) \\ \text{full field} & & \text{Gaussian} & & \text{non-Gaussian part} \end{array}$$

# INITIAL CONDITIONS: MATHS

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Simplest case: local non-Gaussianity

$$\Phi(\mathbf{x}) = \Phi_G(\mathbf{x}) + f_{\text{NL}}(\Phi_G^2(\mathbf{x}) - \langle \Phi_G^2 \rangle)$$



# INITIAL CONDITIONS: MATHS

Aim: Create non-Gaussian field

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Simplest case: local non-Gaussianity  $\Phi(\mathbf{x}) = \Phi_G(\mathbf{x}) + f_{\text{NL}}(\Phi_G^2(\mathbf{x}) - \langle \Phi_G^2 \rangle)$

General case: arbitrary bispectrum  $B_\Phi$

$$\Phi_{NG}(\mathbf{k}) = \frac{f_{\text{NL}}}{2} \int \frac{d^3\mathbf{k}' d^3\mathbf{k}''}{(2\pi)^3} \delta_D(\mathbf{k} - \mathbf{k}' - \mathbf{k}'') W_B(k, k', k'') \Phi_G(\mathbf{k}') \Phi_G(\mathbf{k}'')$$

Wagner et al 2010

$$W_B(k, k', k'') \equiv \frac{B_\Phi(k, k', k'')}{P_\Phi(k)P_\Phi(k') + P_\Phi(k)P_\Phi(k'') + P_\Phi(k')P_\Phi(k'')} \quad (=2 \text{ in local case})$$

Symmetrisation required to preserve power spectrum

# SPEED?

- **Non-separable** bispectrum kernel:  $W_B(k, k', k'') = \frac{1}{k + k' + k''}$

$$\Rightarrow \Phi_{NG}(\mathbf{k}) \sim \int d^3\mathbf{k}' d^3\mathbf{k}'' \frac{1}{k + k' + k''} \Phi_G(\mathbf{k}') \Phi_G(\mathbf{k}'') \quad (\mathbf{k}'' = -\mathbf{k} - \mathbf{k}')$$

⇒ **SLOW**: different integral over  $\mathbf{k}'$  for every  $\mathbf{k}$ , i.e.  $\sim N^2$  operations

$N = \text{total \# ptcles} \sim 10^9$



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$N = \text{total \# ptcles} \sim 10^9$

- **Separable** bispectrum kernel:  $W_B(k, k', k'') = k k' k''$

$$\begin{aligned} \Rightarrow \Phi_{NG}(\mathbf{k}) &\sim \int d^3\mathbf{k}' d^3\mathbf{k}'' k k' k'' \Phi_G(\mathbf{k}') \Phi_G(\mathbf{k}'') \\ &= k \left[ \int d^3\mathbf{k}' k' \Phi_G(\mathbf{k}') \right] \times \left[ \int d^3\mathbf{k}'' k'' \Phi_G(\mathbf{k}'') \right] \end{aligned}$$

⇒ **FAST**: two 3D integrals, i.e.  $\sim N$  operations

# SPEED?

- **Non-separable** bispectrum kernel:  $W_B(k, k', k'') = \frac{1}{k + k' + k''}$

$$(k'' = -k - k')$$

operations

total # ptcles  $\sim 10^9$

Separability = Efficiency

- Separable k

⇒ FAST: two 3D integrals, i.e.  $\sim N$  operations



# FAST INITIAL CONDITIONS

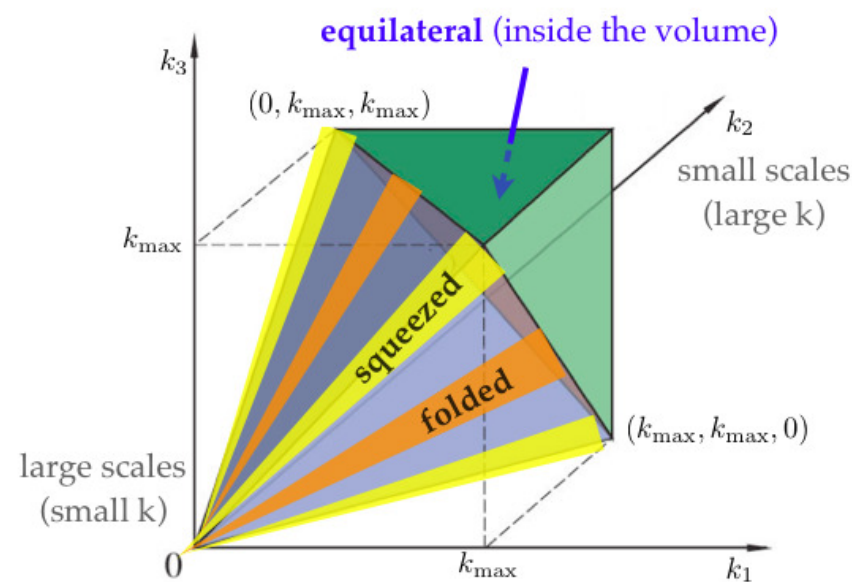
Fergusson, Regan, Shellard PRD 86, 063511 (2012), arXiv: 1008.1730  
 Regan, MS, Shellard, Fergusson PRD 86, 123524 (2012), arXiv:1108.3813

$N = \text{total \# ptcles} \approx 10^9$

Need  $\sim N^2$  operations in general, but only  $\sim N$  operations if  $W_B$  was **separable**:

$$W_B(k, k', k'') = f_1(k)f_2(k')f_3(k'') + \text{perms}$$

Expand  $W_B$  in separable basis functions to get  $\sim N$  scaling for *any*\* bispectrum:



$W_B(k, k', k'')$  on space of triangle configurations

$$= \alpha_0 + \alpha_1 \text{ (triangle 1) } + \alpha_2 \text{ (triangle 2) } + \dots + \alpha_{n_{\max}} \text{ (triangle } n_{\max} \text{)}$$

$$= \alpha_0 + \alpha_1 k k' k'' + \alpha_2 (k k' k'')^2 + \dots$$

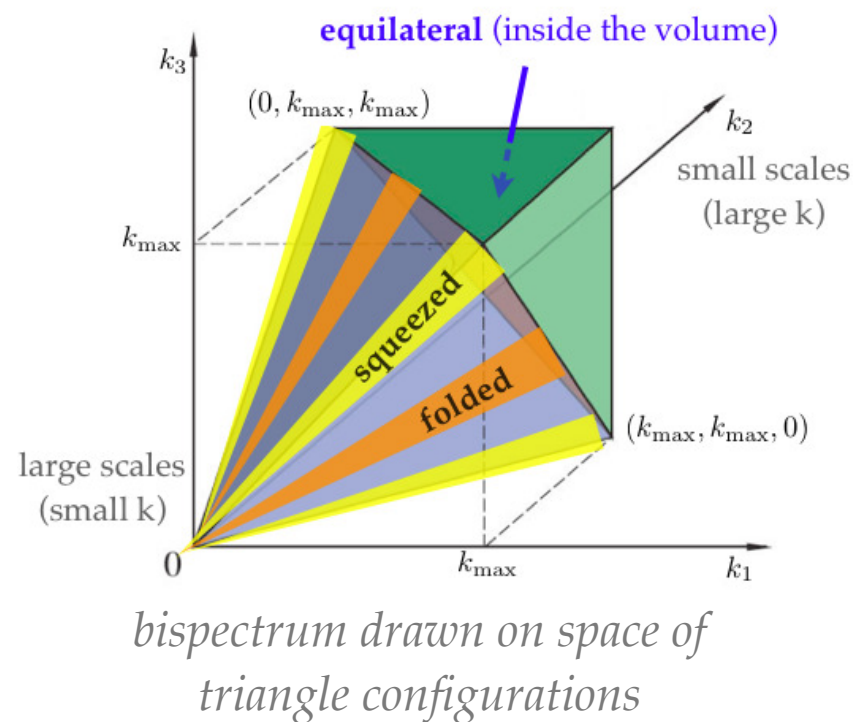
*expansion in separable basis functions  
 (decorrelate for convenience; around 100 basis functions  
 represent all investigated bispectra with high accuracy)*

\*Scoccimarro and Verde groups try to rewrite  $W_B$  analytically in separable form; this works sometimes, but not in general

# INITIAL CONDITIONS

Regan, MS, Shellard, Fergusson PRD 86, 123524 (2012), arXiv:1108.3813

- Fast and general non-Gaussian **initial conditions** for N-body simulations
  - Arbitrary (including non-separable) bispectra, diagonal-independent trispectra
  - This is the only method to simulate structure formation for general inflation models to date
  - Idea:



$$= \alpha_0 + \alpha_1 \text{ (triangle 1)} + \alpha_2 \text{ (triangle 2)} + \dots + \alpha_{n_{\max}} \text{ (triangle } n_{\max})$$

*expansion in separable, uncorrelated basis functions  
(around 100 basis functions represent all investigated  
bispectra with high accuracy)*



# NON-GAUSSIAN N-BODY SIMS

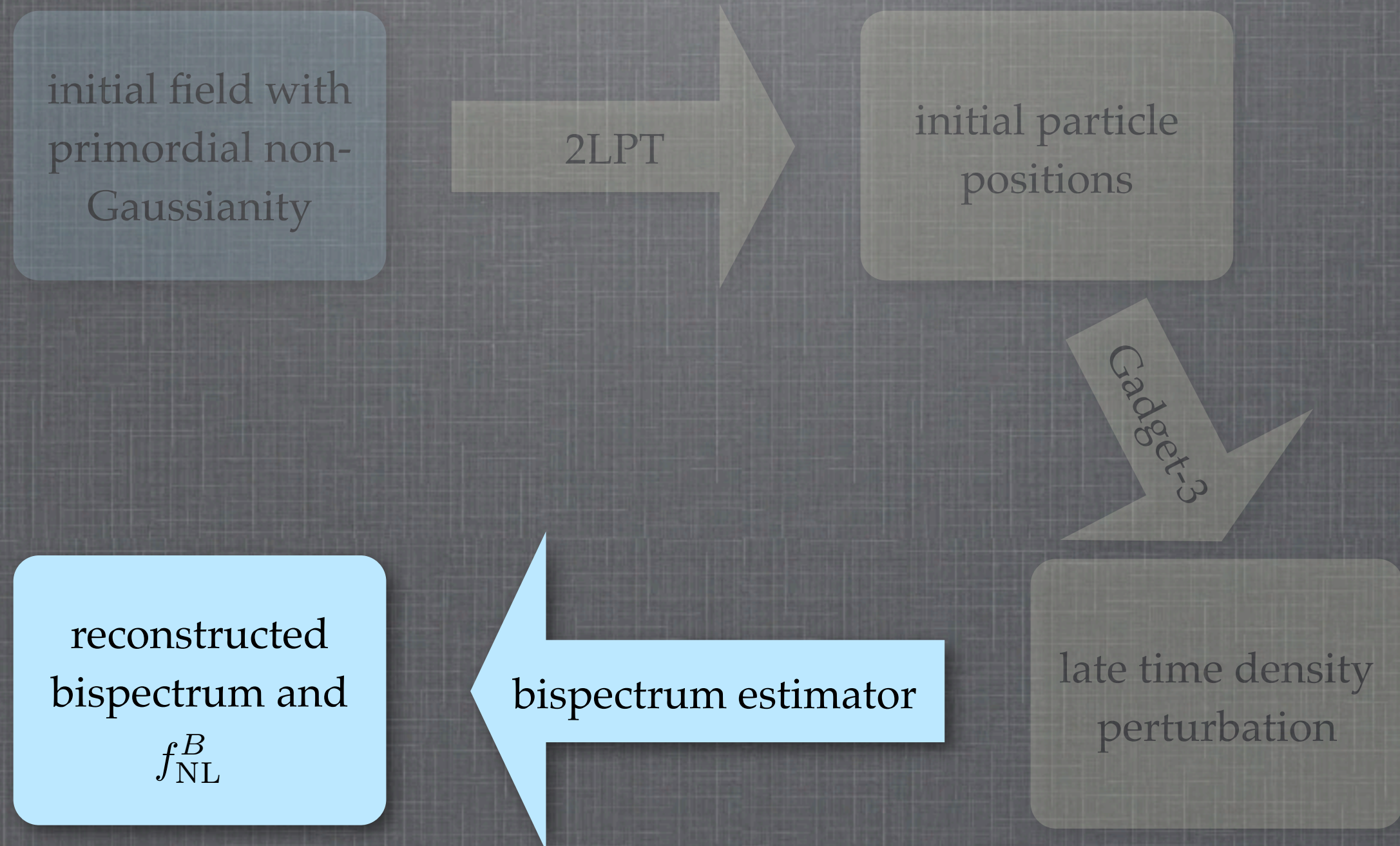
MS, Regan, Shellard 1207.5678

- Application:
  - Generate non-Gaussian density
  - Convert to initial particle positions and velocities by applying 2LPT to glass configuration or regular grid (spurious bispectrum at high  $z$  decays at low  $z$ )
  - Feed into Gadget3

Name	NG shape	$f_{\text{NL}}$	$L[\frac{\text{Mpc}}{h}]$	$N_p$	$z_i$	$L_s[\frac{\text{kpc}}{h}]$	$N_r$	glass
G512g	–	–	1600	512	49	156	3	yes
G512	–	–	1600	512	49	156	3	no
$G_L^{512}$	–	–	{400, 100}	512	49	{39, 9.8}	3	no
G768	–	–	2400	768	19	90	3	no
G1024	–	–	1875	1024	19	40	2	no
Loc10g	local	10	1600	512	49	156	3	yes
Loc10	local	10	1600	512	49	156	3	no
$\text{Loc10}_L^{512}$	local	10	{400, 100}	512	49	{39, 9.8}	3	no
$\text{Loc10}^-$	local	–10	1600	512	49	156	3	no
Loc20	local	20	1600	512	49	156	3	no
Loc50	local	50	1600	512	49	156	3	no
Eq100g	equil	100	1600	512	49	156	3	yes
Eq100	equil	100	1600	512	49	156	3	no
$\text{Eq100}_L^{512}$	equil	100	{400, 100}	512	49	{39, 9.8}	3	no
$\text{Eq100}^-$	equil	–100	1600	512	49	156	3	no
Orth100g	orth	100	1600	512	49	156	3	yes
Orth100	orth	100	1600	512	49	156	3	no
$\text{Orth100}_{400}^{512}$	orth	100	400	512	49	39	3	no
$\text{Orth100}^-$	orth	–100	1600	512	49	156	3	no
Flat10	flat	10	1600	512	49	156	3	no
$\text{Flat10}_{400}^{512}$	flat	100	400	512	49	39	3	no



# BISPECTRUM ESTIMATION





# BISPECTRUM ESTIMATION: MATHS

Fergusson, Shellard et al. 2009-2012  
MS, Regan, Shellard 1207.5678

Likelihood for  $f_{\text{NL}}$  given a density perturbation  $\delta_{\mathbf{k}}$

$$\mathcal{L} \propto \int \frac{d^3\mathbf{k}_1}{(2\pi)^3} \frac{d^3\mathbf{k}_2}{(2\pi)^3} \frac{d^3\mathbf{k}_3}{(2\pi)^3} \left[ 1 - \frac{1}{6} \underbrace{\langle \delta_{\mathbf{k}_1} \delta_{\mathbf{k}_2} \delta_{\mathbf{k}_3} \rangle}_{\propto f_{\text{NL}} B_\delta} \frac{\partial}{\partial \delta_{\mathbf{k}_1}} \frac{\partial}{\partial \delta_{\mathbf{k}_2}} \frac{\partial}{\partial \delta_{\mathbf{k}_3}} + \dots \right] \frac{1}{\sqrt{\det C}} \prod_{ij} e^{-\frac{1}{2} \delta_{\mathbf{k}_i}^* (C^{-1})_{ij} \delta_{\mathbf{k}_j}}$$

$\propto P_\delta$

Maximise w.r.t.  $f_{\text{NL}}$  (given a theoretical bispectrum  $B_\delta^{\text{theo}}$ )

$$\hat{f}_{\text{NL}}^{B_\delta^{\text{theo}}} = \frac{1}{N_{f_{\text{NL}}}} \int \frac{d^3\mathbf{k}_1}{(2\pi)^3} \frac{d^3\mathbf{k}_2}{(2\pi)^3} \frac{d^3\mathbf{k}_3}{(2\pi)^3} \frac{(2\pi)^3 \delta_D(\mathbf{k}_1 + \mathbf{k}_2 + \mathbf{k}_3) B_\delta^{\text{theo}}(k_1, k_2, k_3) \delta_{\mathbf{k}_1} \delta_{\mathbf{k}_2} \delta_{\mathbf{k}_3}}{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$$

Requires  $\sim N^2$  operations in general, but only  $\sim N$  operations if  $B_\delta^{\text{theo}}$  was separable

- ⇒ Measure amplitudes  $\beta_n^R$  of separable basis functions
- ⇒ Combine them to reconstruct full bispectrum from the data:

$$\hat{B}(k_1, k_2, k_3) = \sum_n \beta_n^R \sqrt{\frac{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}{k_1 k_2 k_3}} R_n(k_1, k_2, k_3)$$

depends on data

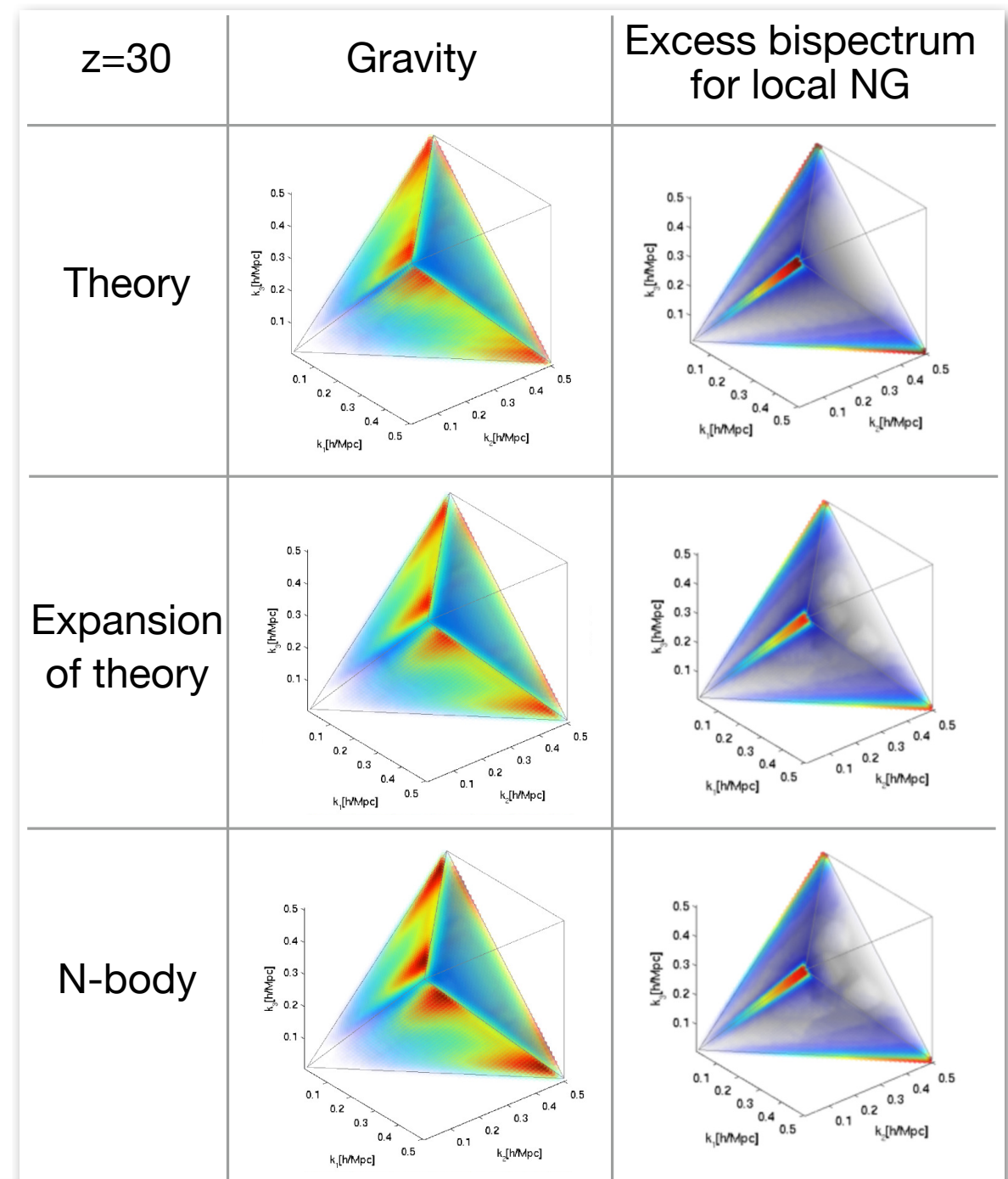
where  $\beta_n^R \equiv \sum_m \lambda_{nm} \beta_m^Q$ ,  $\beta_m^Q \equiv \int d^3\mathbf{x} M_r(\mathbf{x}) M_s(\mathbf{x}) M_t(\mathbf{x})$ ,  $M_r(\mathbf{x}) \equiv \int \frac{d^3\mathbf{k}}{(2\pi)^3} e^{i\mathbf{k}\mathbf{x}} \frac{q_r(k) \delta_{\mathbf{k}}^{\text{obs}}}{\sqrt{k P_\delta(k)}}$

# BISPECTRUM ESTIMATION

MS, Regan, Shellard 1207.5678

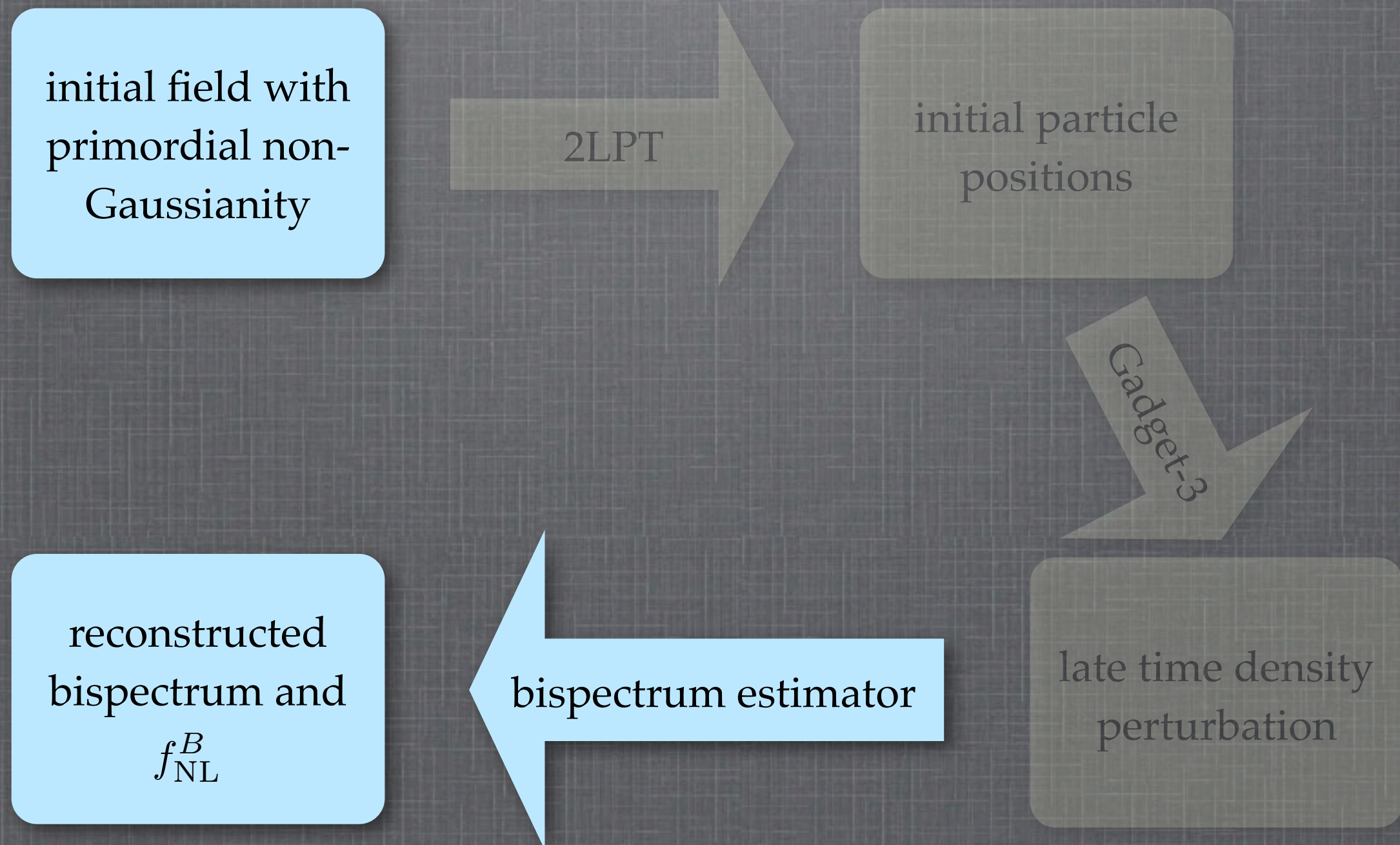
## ► Fast and general **bispectrum estimator** for $N$ -body simulations

- Measure  $\sim 100 f_{\text{NL}}$  amplitudes of separable basis shapes, combine them to reconstruct the full bispectrum
- Scales like  $100 \times N$  instead of  $N^2$ , where  $N \sim 10^9$  (speedup by factor  $\sim 10^7$ )
- Can estimate bispectrum whenever power spectrum is typically measured
- Validated against PT at high  $z$
- Useful compression to  $\sim 100$  numbers
- Automatically includes all triangles
- Loss of total  $S/N$  due to truncation of basis is only a few percent (could be improved with larger basis; for  $\sim N$  basis functions the estimator would be exact)



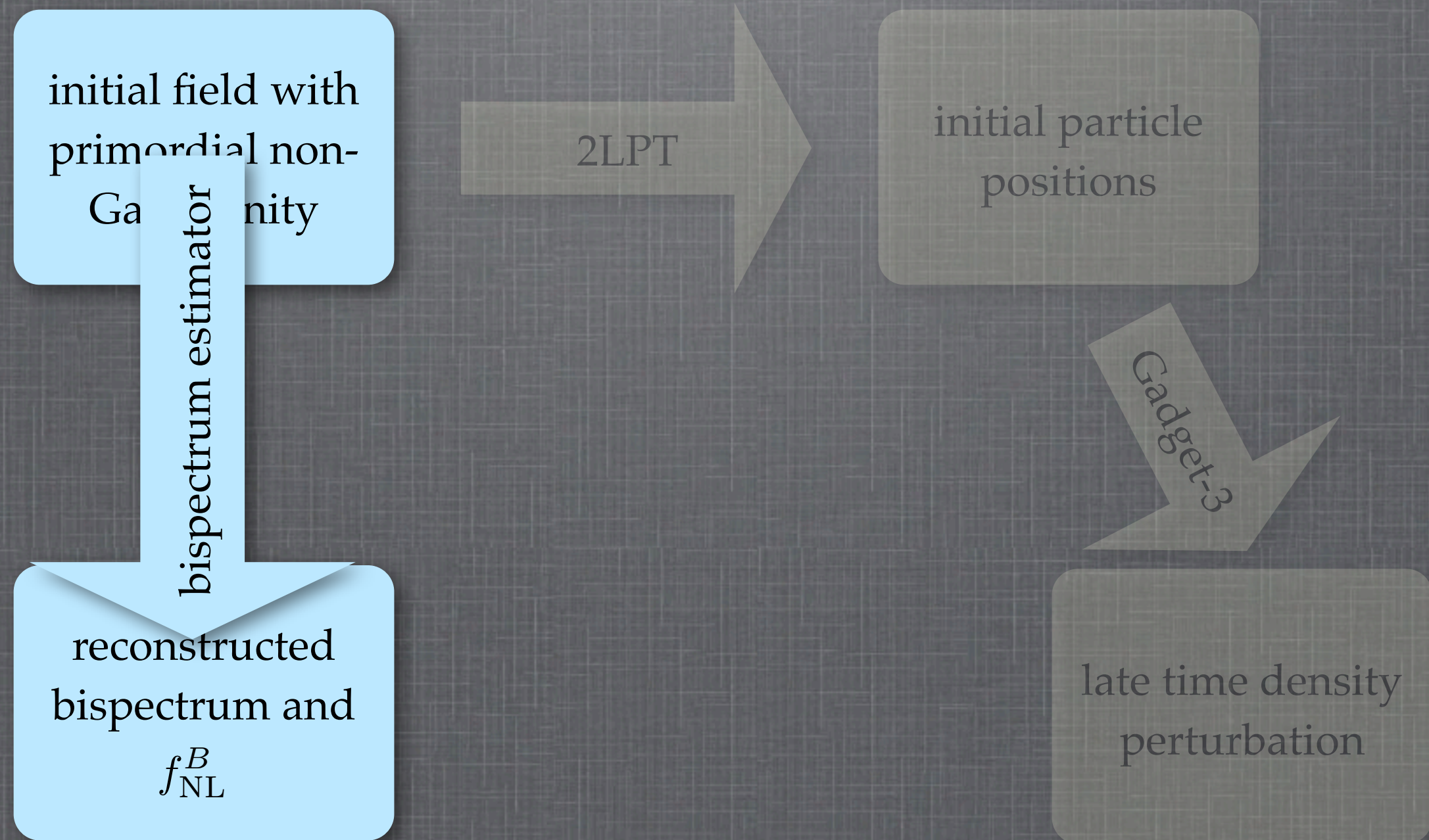


# CONSISTENCY CHECK





# CONSISTENCY CHECK



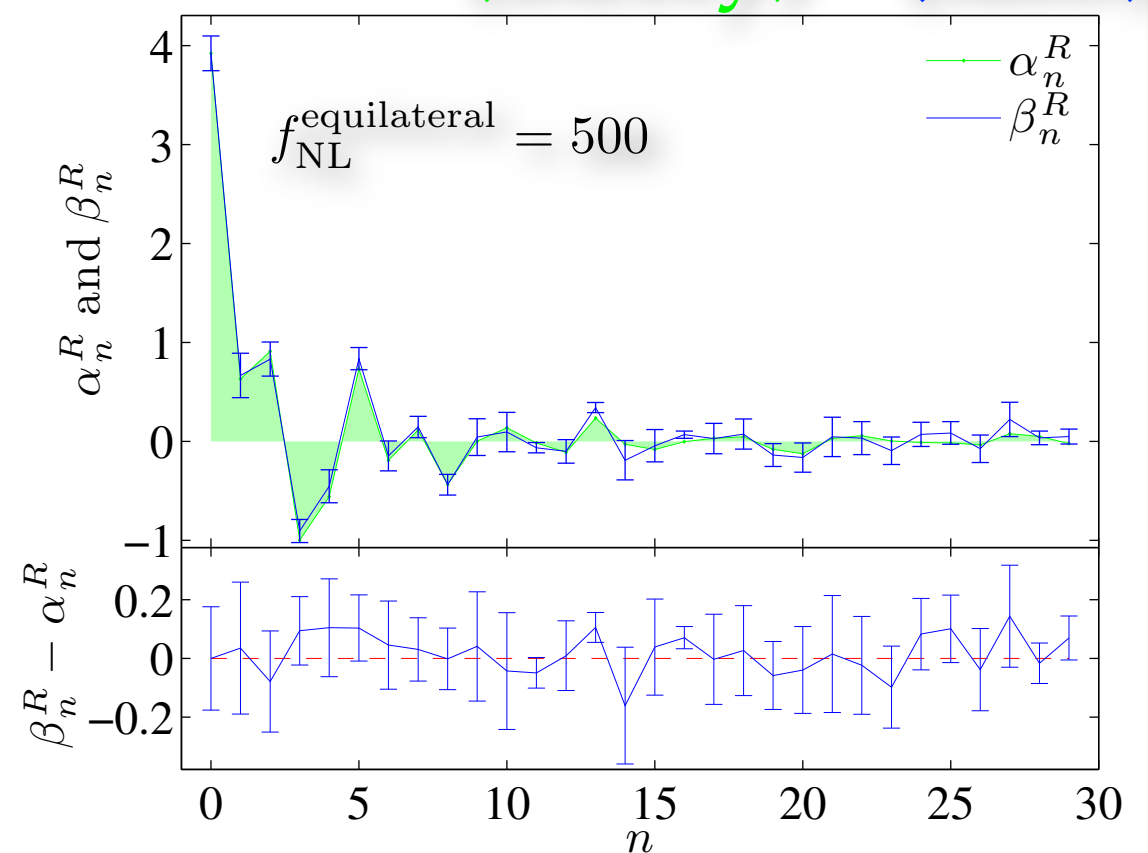
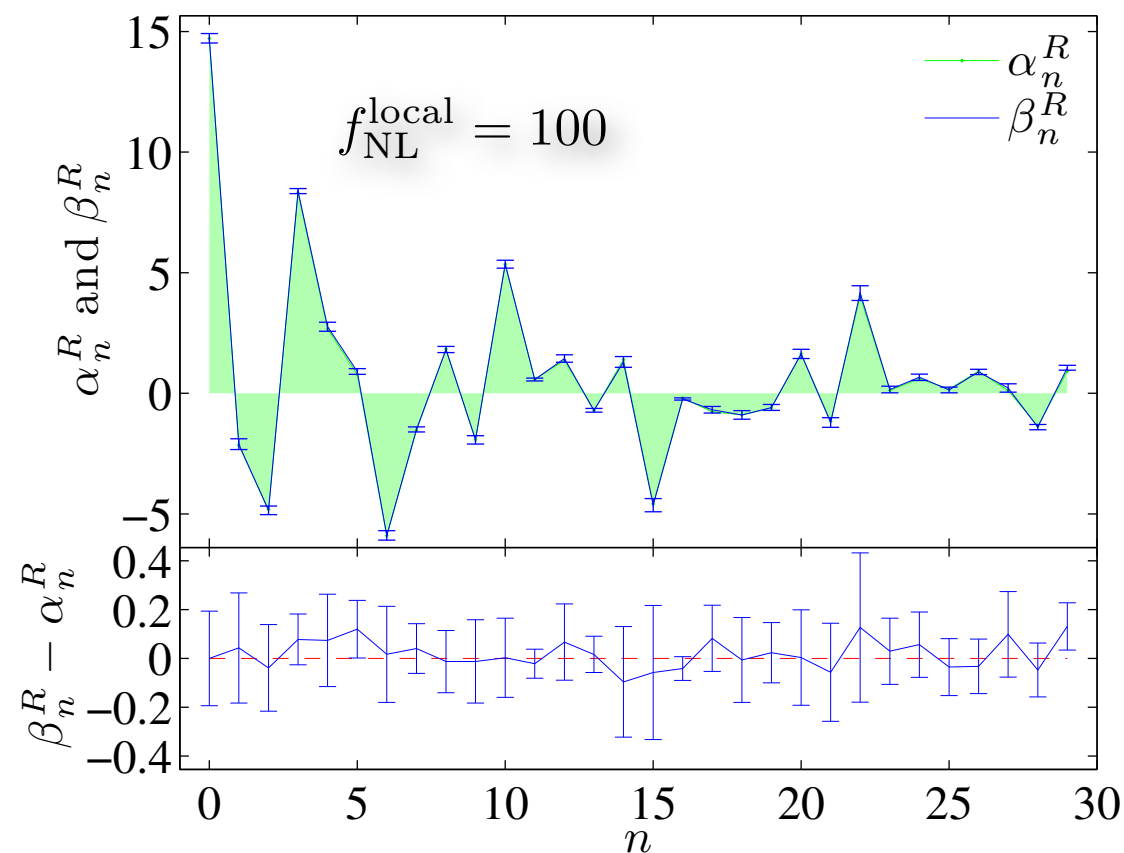


# CONSISTENCY CHECK

Regan, MS, Shellard, Fergusson 1108.3813

Generate non-Gaussian field  $\Phi$  and estimate its bispectrum, both with separable mode expansion (no time evolution)

(theory) (sims)

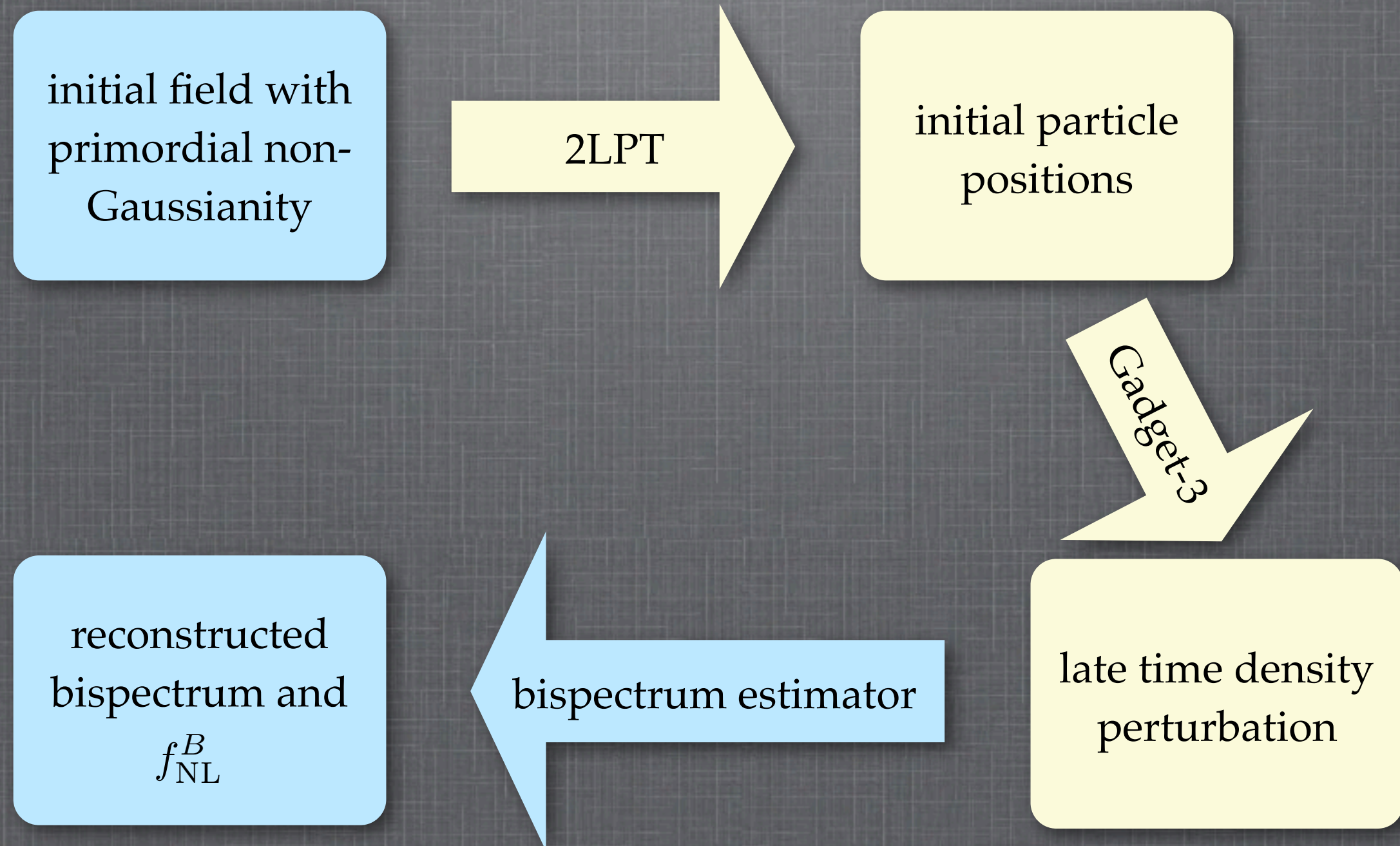


5 realisations with  $N = 512$  and  $L = 100 \text{ Mpc}/h$

more shapes and generalisation to trispectrum: 1108.3813



# FULL RUN & RESULTS





# GAUSSIAN SIMULATIONS



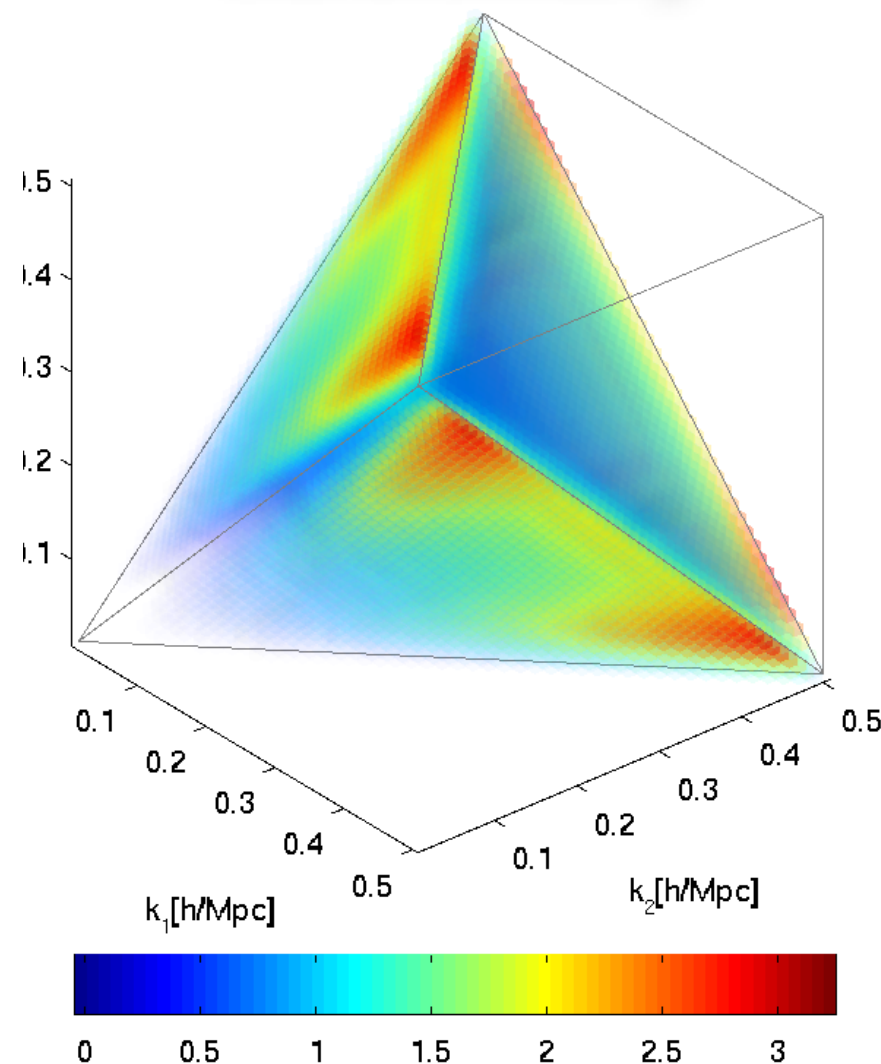
# GAUSSIAN SIMULATIONS

## COMPARISON WITH TREE LEVEL

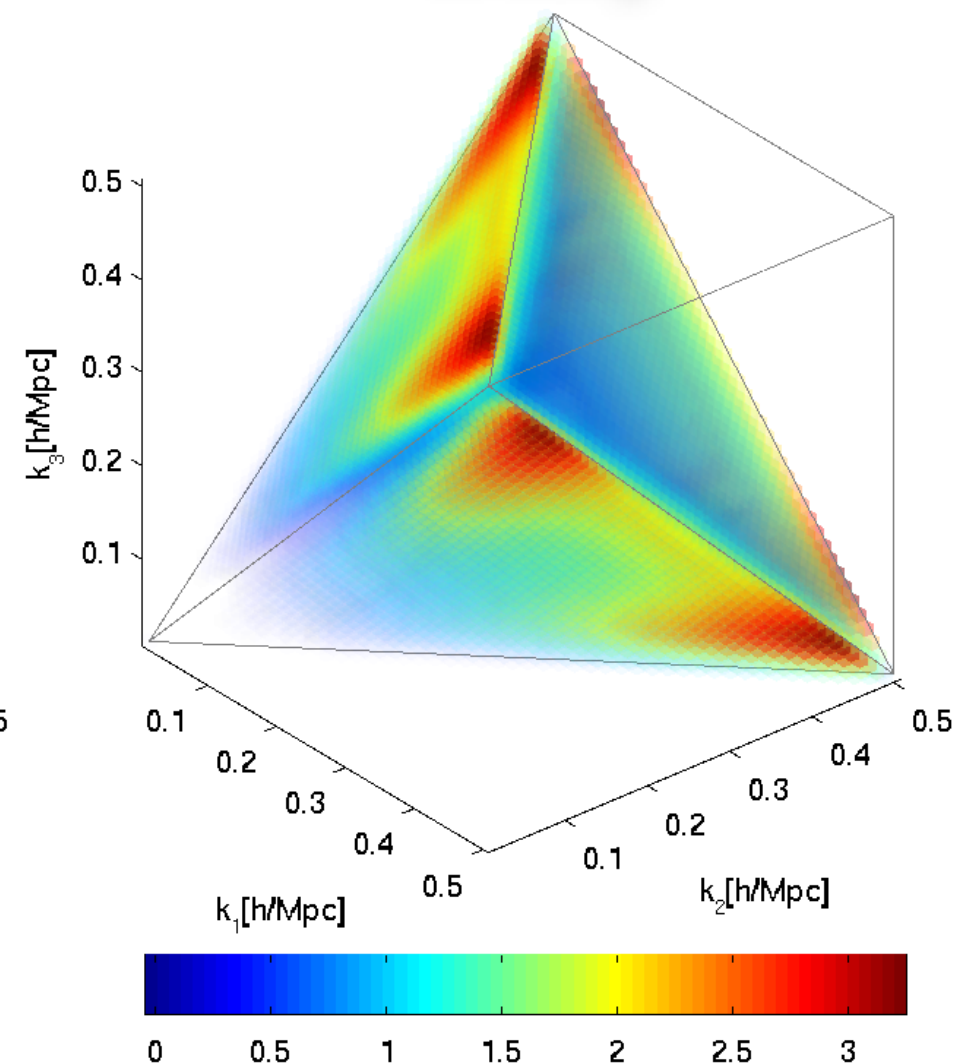
MS, Regan, Shellard 1207.5678

$z=30$

*Tree level theory*



*N-body*



Plot  $S/N$  weighted bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

3 realisations of  $512^3$  particles in a  $L = 1600 \text{ Mpc}/h$  box with  $z_{\text{init}} = 49$  and  $k = 0.004 - 0.5 \text{ h}/\text{Mpc}$



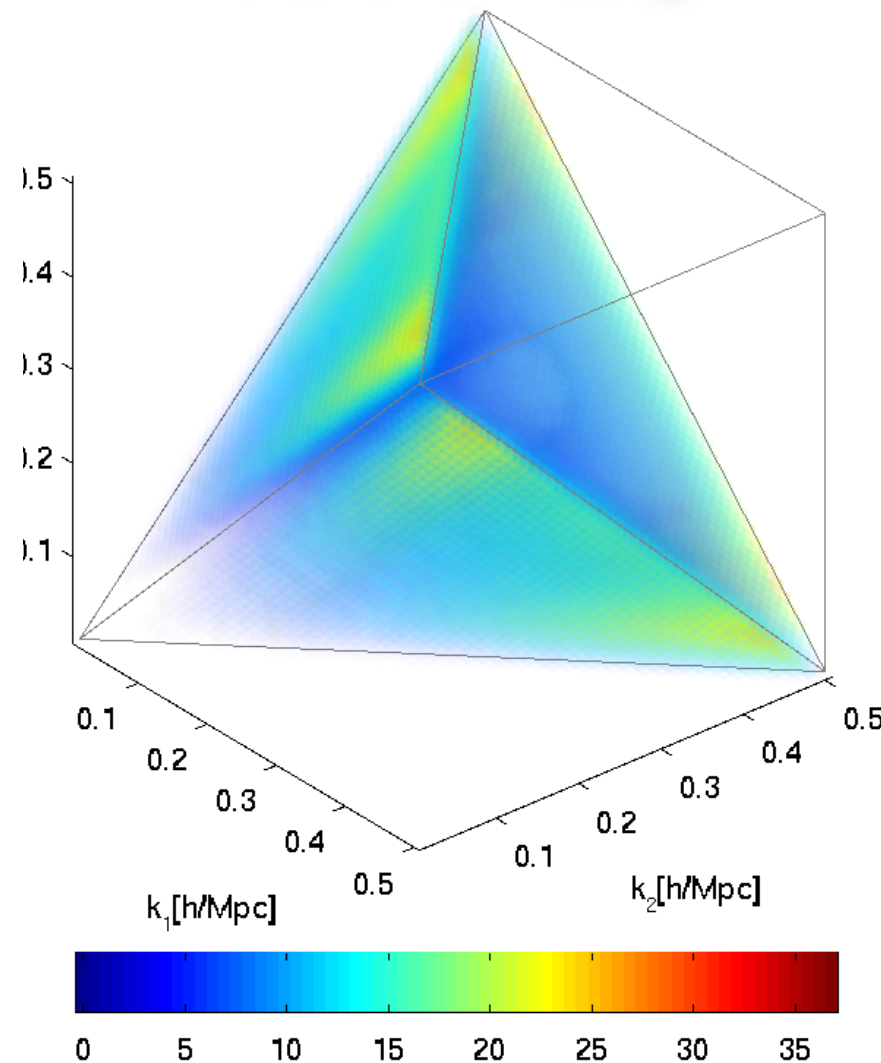
# GAUSSIAN SIMULATIONS

## COMPARISON WITH TREE LEVEL

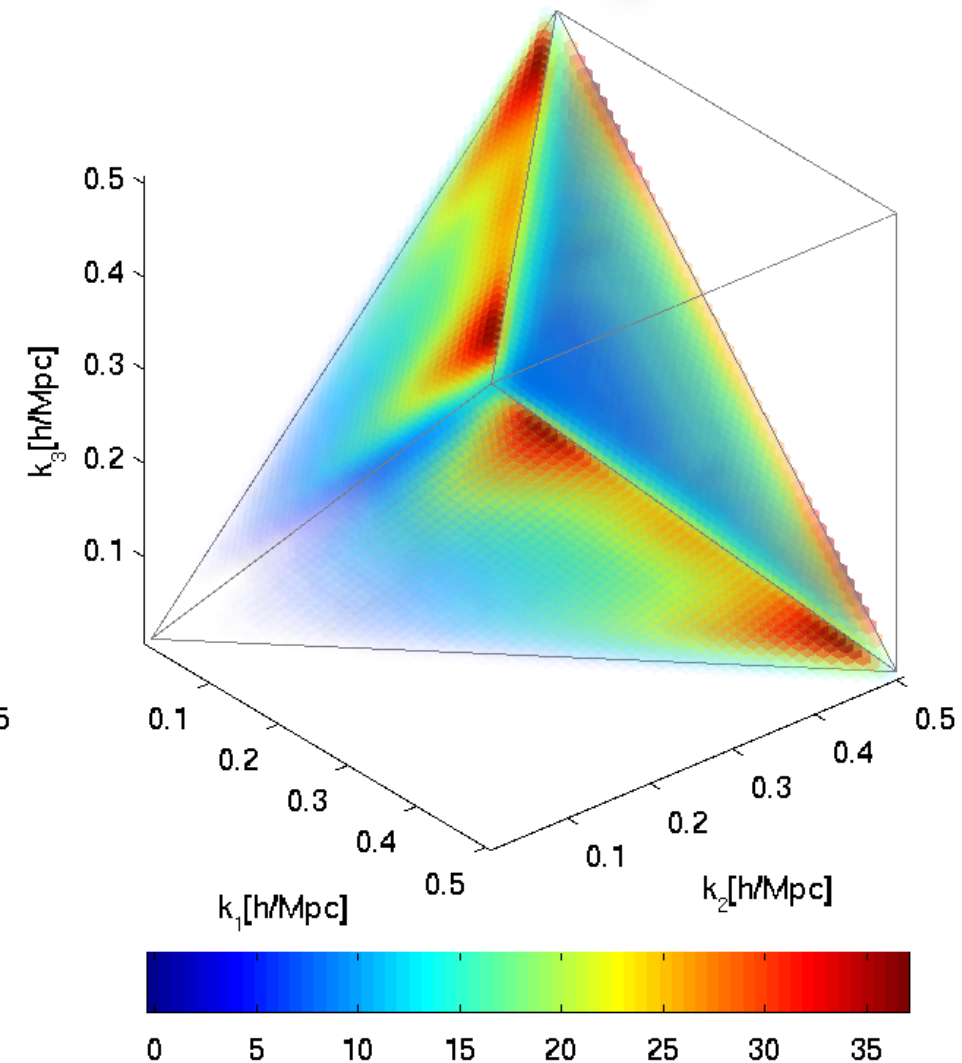
MS, Regan, Shellard 1207.5678

$z=2$

*Tree level theory*



*N-body*



Plot  $S/N$  weighted bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

3 realisations of  $512^3$  particles in a  $L = 1600 \text{ Mpc}/h$  box with  $z_{\text{init}} = 49$  and  $k = 0.004 - 0.5 \text{ h}/\text{Mpc}$

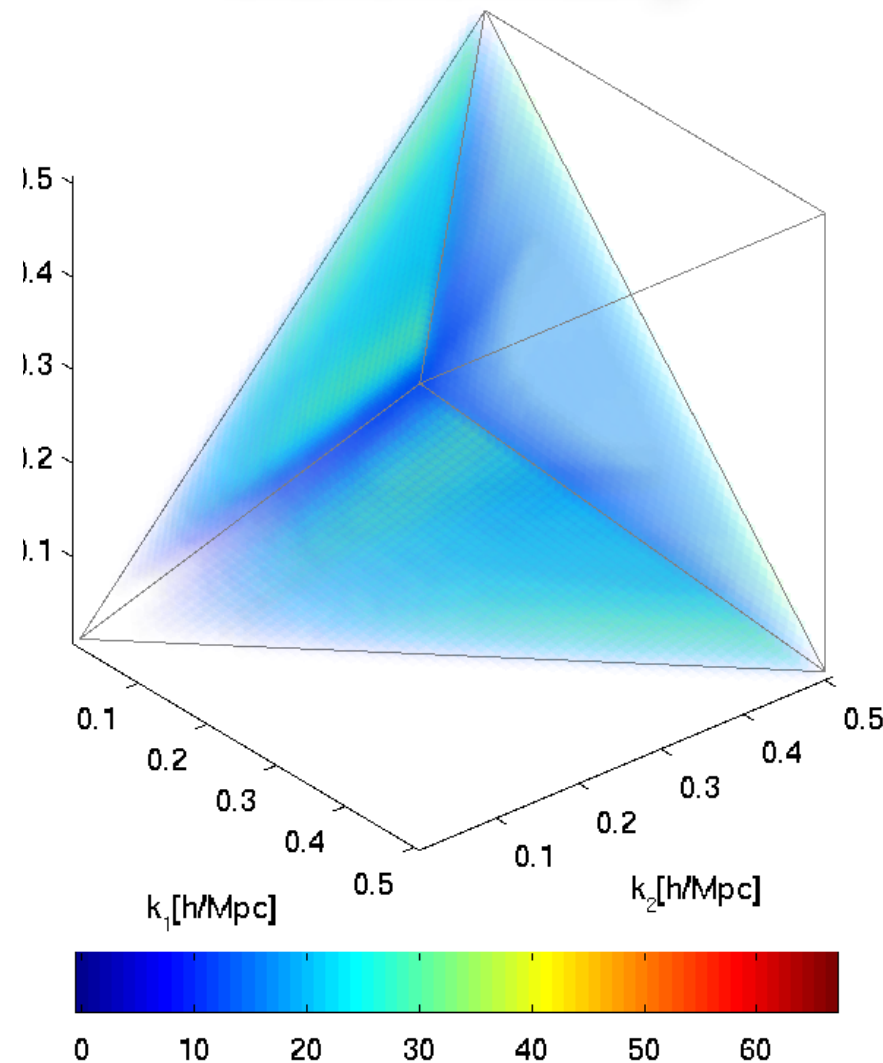
# GAUSSIAN SIMULATIONS

## COMPARISON WITH TREE LEVEL

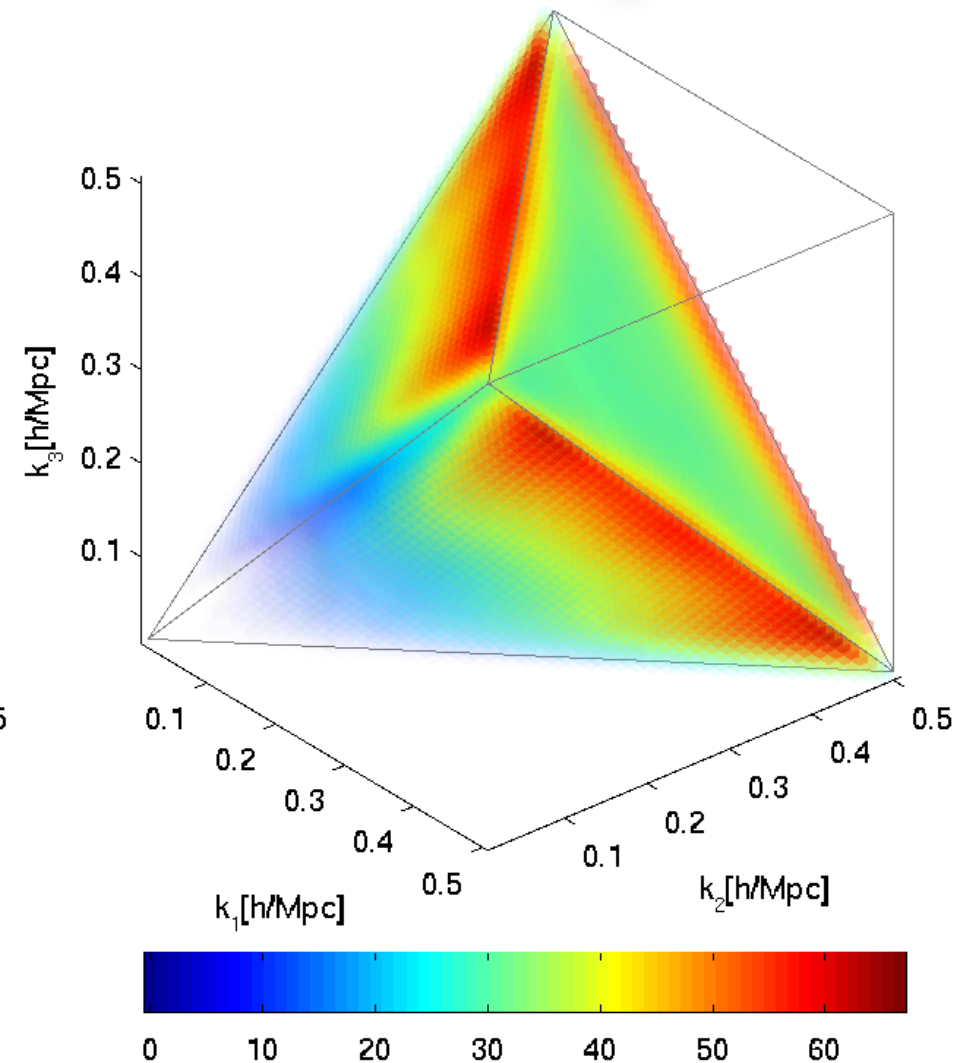
MS, Regan, Shellard 1207.5678

$z=0$

*Tree level theory*



*N-body*



Plot  $S/N$  weighted bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

3 realisations of  $512^3$  particles in a  $L = 1600 \text{ Mpc}/h$  box with  $z_{\text{init}} = 49$  and  $k = 0.004 - 0.5 \text{ h}/\text{Mpc}$



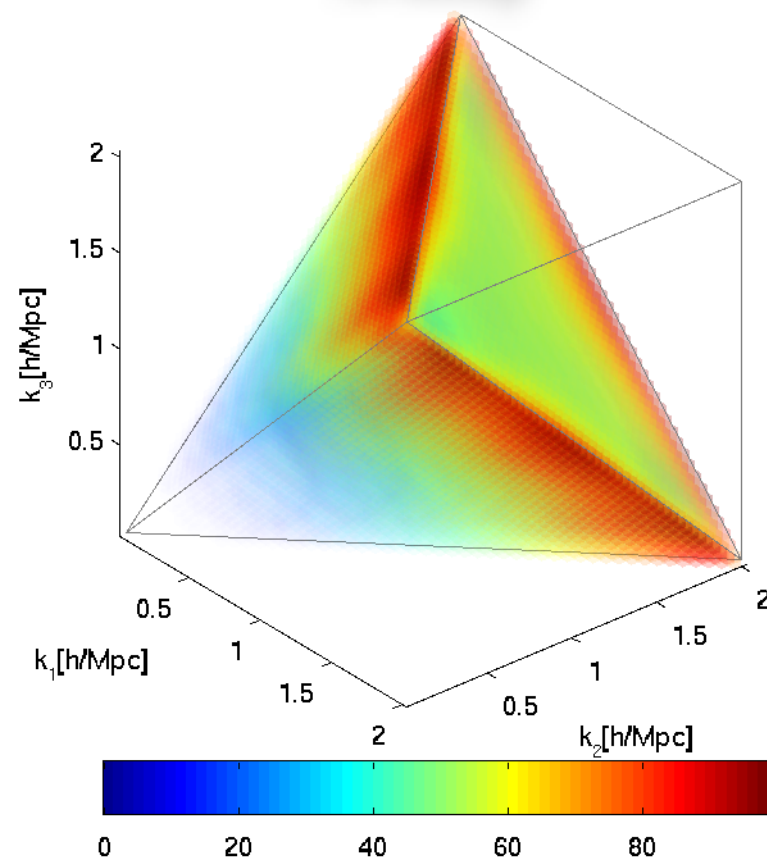
# GAUSSIAN SIMULATIONS ON SMALL SCALES

MS, Regan, Shellard 1207.5678

**z=2**

z=2

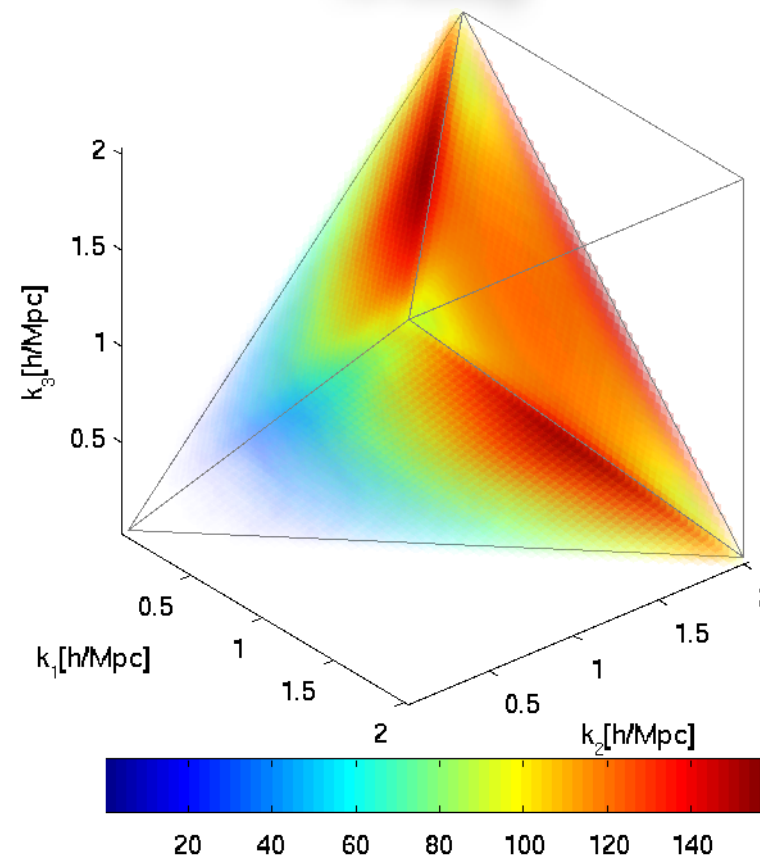
*N-body*



**z=1**

z=1

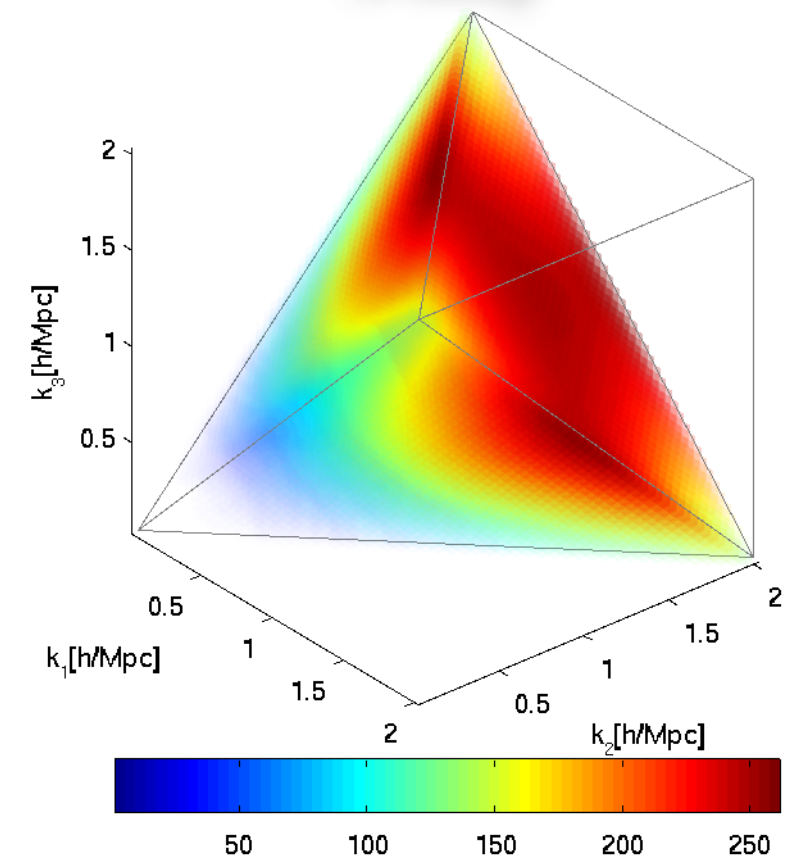
*N-body*



**z=0**

z=0

*N-body*



Plot  $S/N$  weighted bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

3 realisations of  $512^3$  particles in a  $L = 400$  Mpc/ $h$  box with  $z_{\text{init}} = 49$  and  $k = 0.016 - 2.0$   $h/\text{Mpc}$

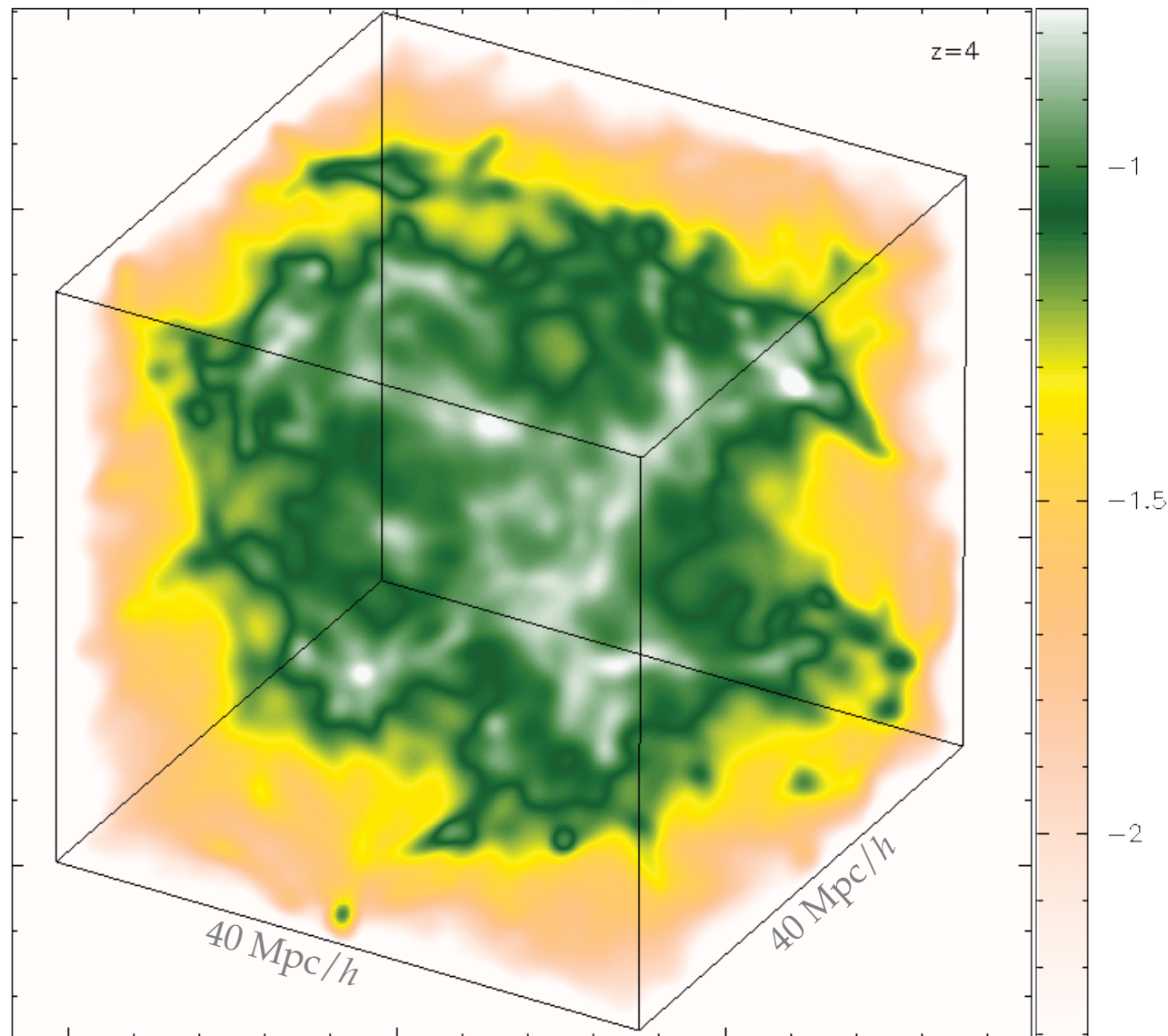
# GAUSSIAN SIMULATIONS

## COMPARISON WITH DARK MATTER

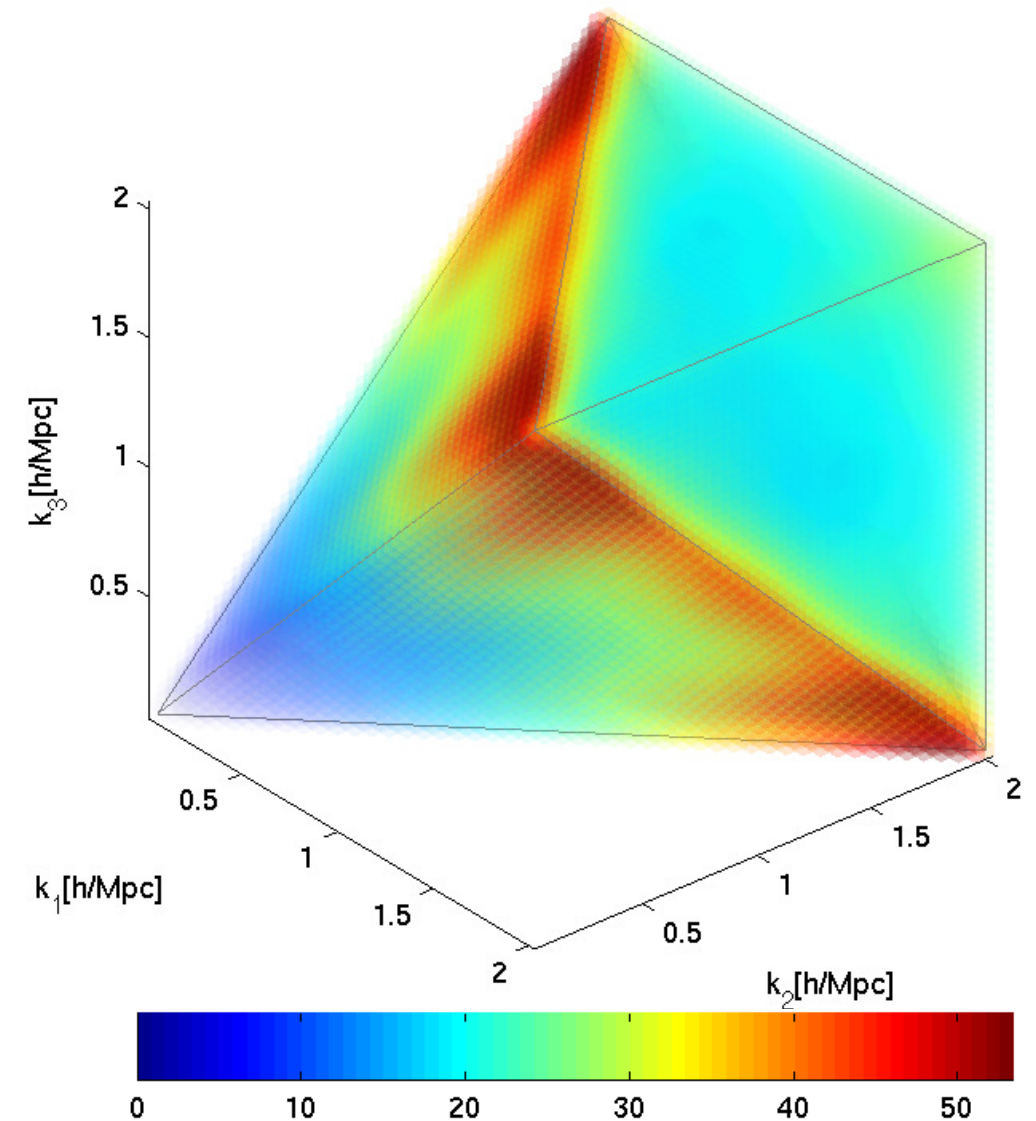
$z=4$

MS, Regan, Shellard 1207.5678

*DM density*



*DM bispectrum*



Plot DM density in  $(40 \text{ Mpc}/h)^3$  subbox and bispectrum signal  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$   
512<sup>3</sup> particles in a  $L = 400 \text{ Mpc}/h$  box with  $z_{\text{init}} = 49$  and  $k = 0.016 - 2 \text{ h}/\text{Mpc}$



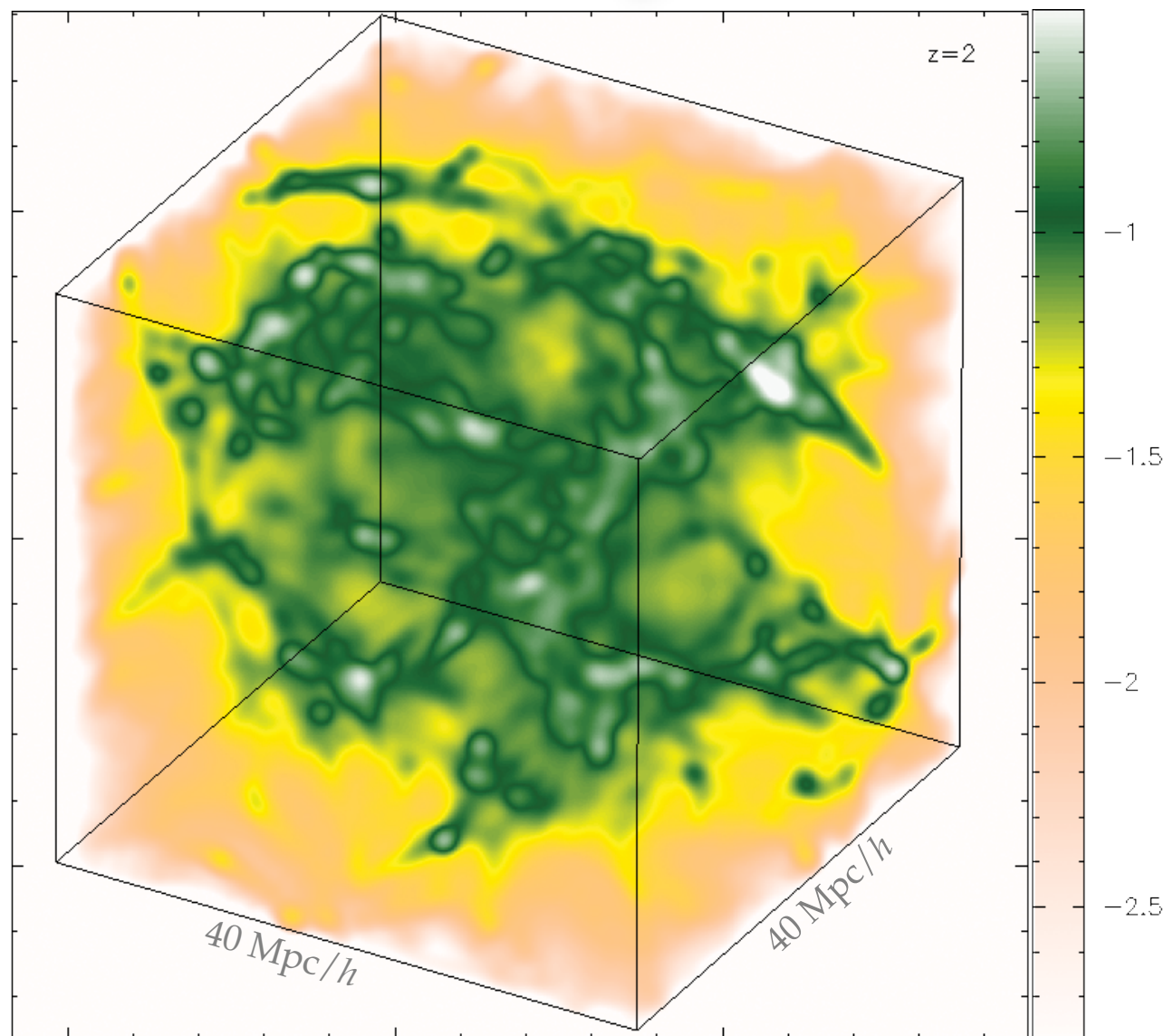
# GAUSSIAN SIMULATIONS

## COMPARISON WITH DARK MATTER

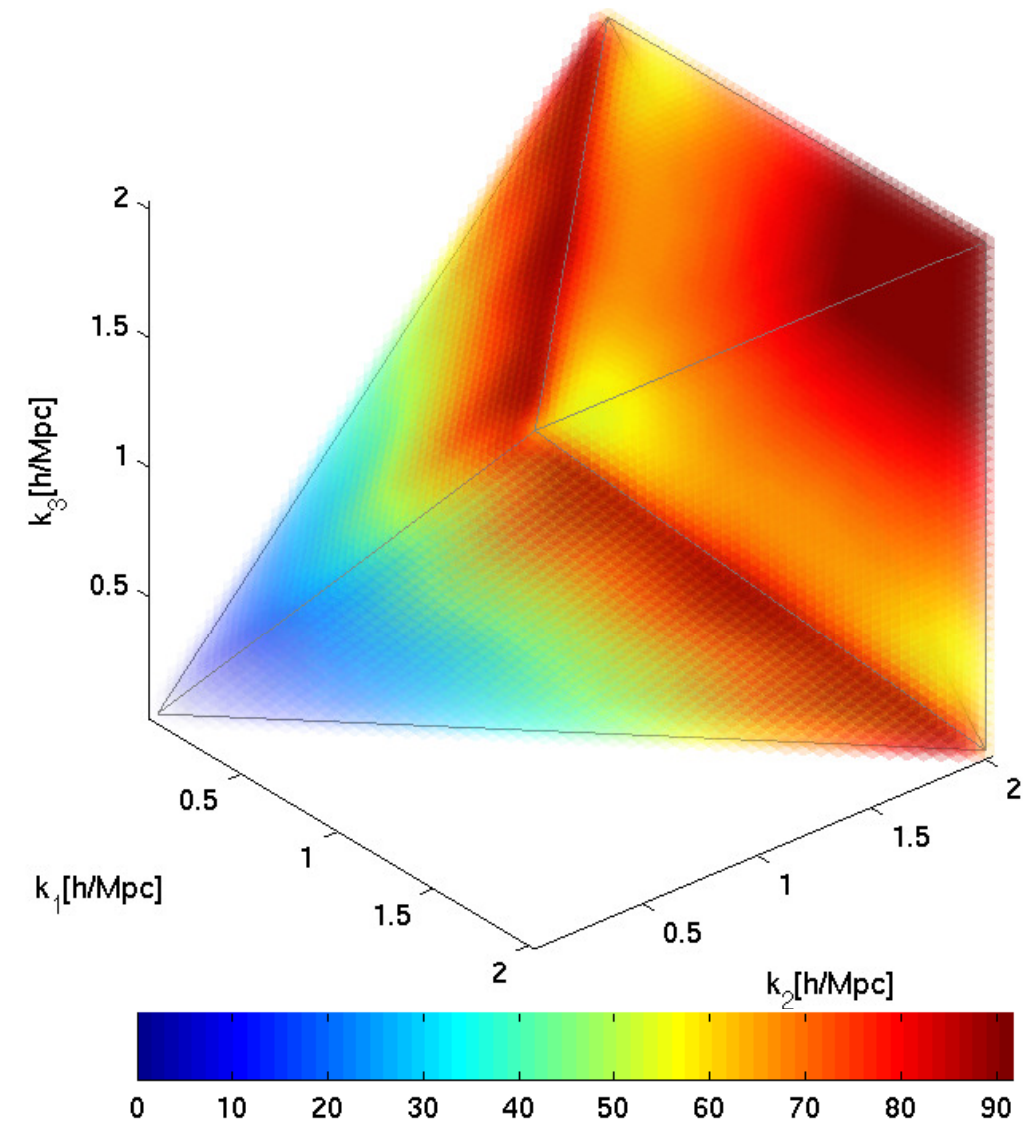
$z=2$

MS, Regan, Shellard 1207.5678

*DM density*



*DM bispectrum*



Plot DM density in  $(40 \text{ Mpc}/h)^3$  subbox and bispectrum signal  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$   
512<sup>3</sup> particles in a  $L = 400 \text{ Mpc}/h$  box with  $z_{\text{init}} = 49$  and  $k = 0.016 - 2 \text{ h}/\text{Mpc}$

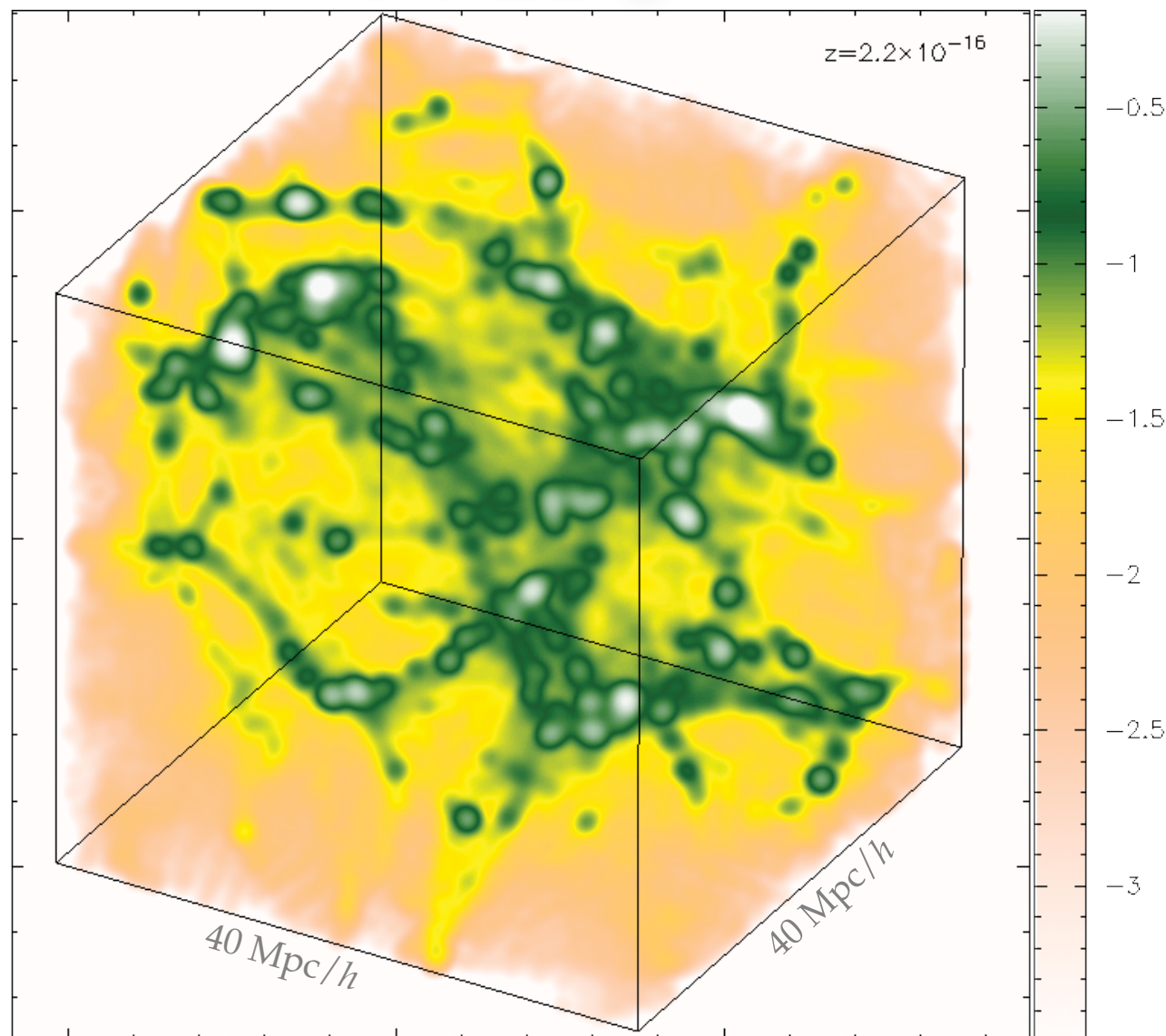
# GAUSSIAN SIMULATIONS

## COMPARISON WITH DARK MATTER

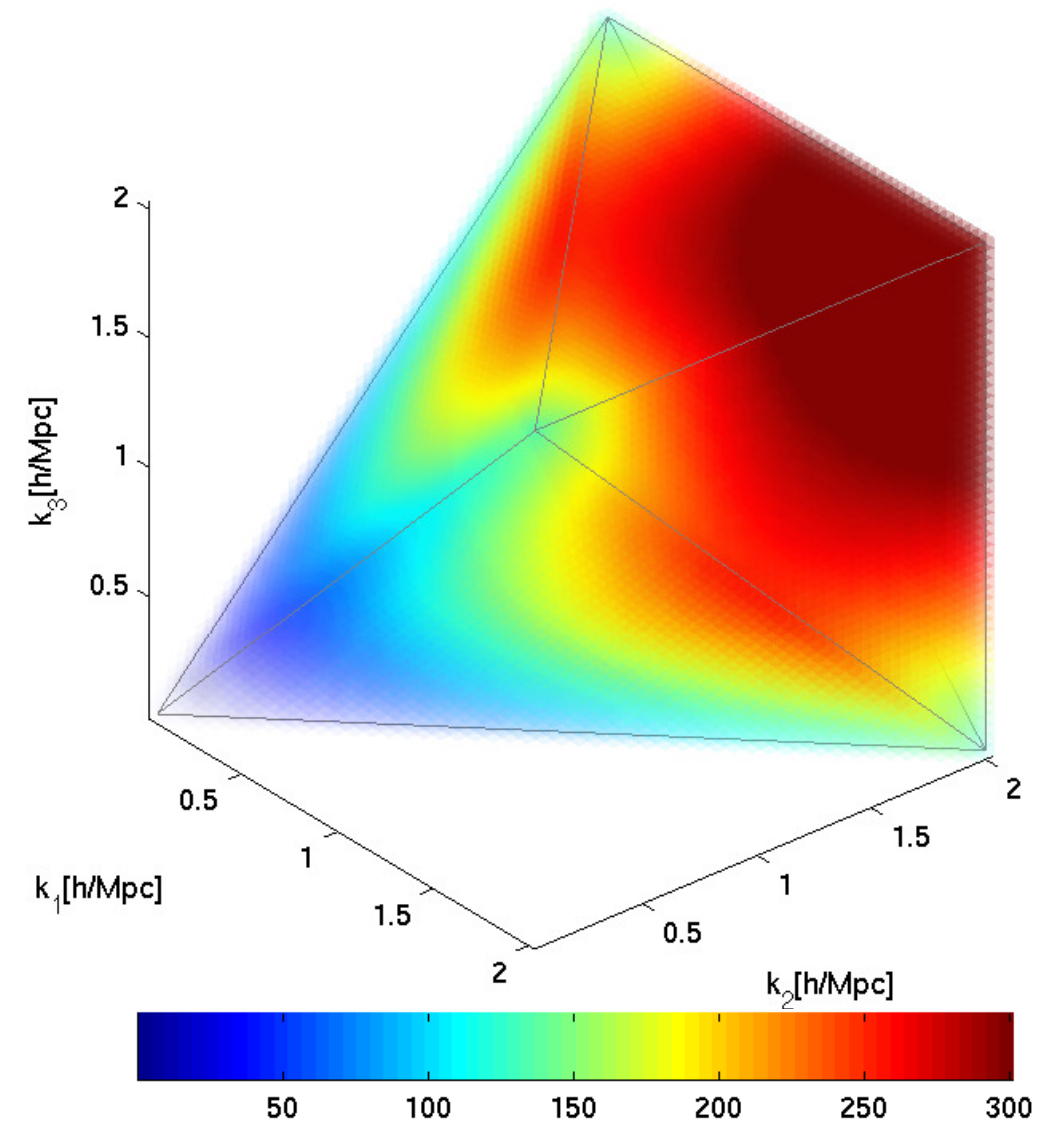
$z=0$

MS, Regan, Shellard 1207.5678

*DM density*



*DM bispectrum*



Plot DM density in  $(40 \text{ Mpc}/h)^3$  subbox and bispectrum signal  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$   
512<sup>3</sup> particles in a  $L = 400 \text{ Mpc}/h$  box with  $z_{\text{init}} = 49$  and  $k = 0.016 - 2 \text{ h}/\text{Mpc}$



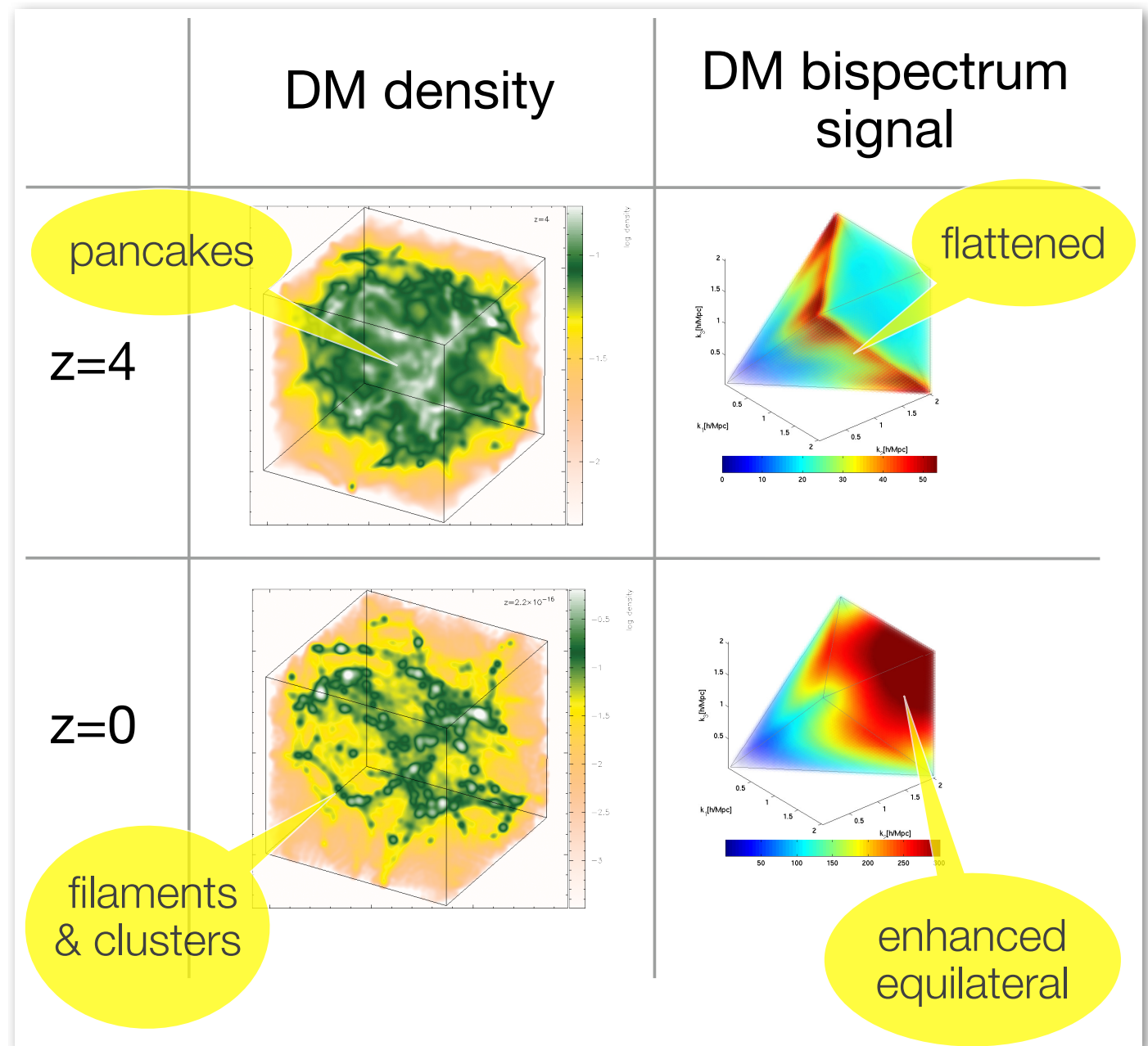
# GAUSSIAN SIMULATIONS

## SUMMARY

MS, Regan, Shellard 1207.5678

### ► Summary Gaussian N-body simulations

- Measured gravitational DM bispectrum for all triangles down to  $k=2h\text{Mpc}^{-1}$
- Non-linearities mainly enhance 'constant' 1-halo bispectrum
- Bispectrum characterises 3d DM structures like pancakes, filaments, clusters
- Self-similarity  
(constant contribution appears towards late times at fixed length scale, and towards small scales at fixed time)





# NON-GAUSSIAN SIMULATIONS

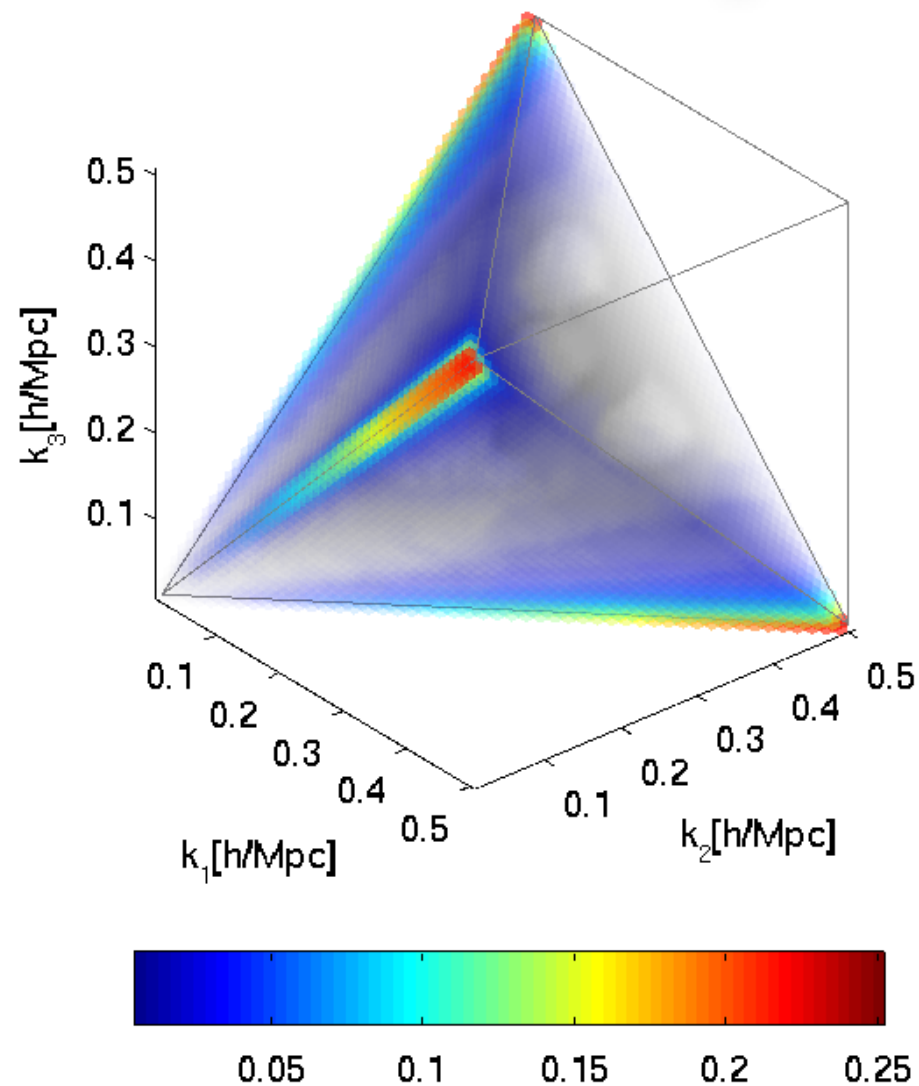


# LOCAL NON-GAUSSIAN SIMS

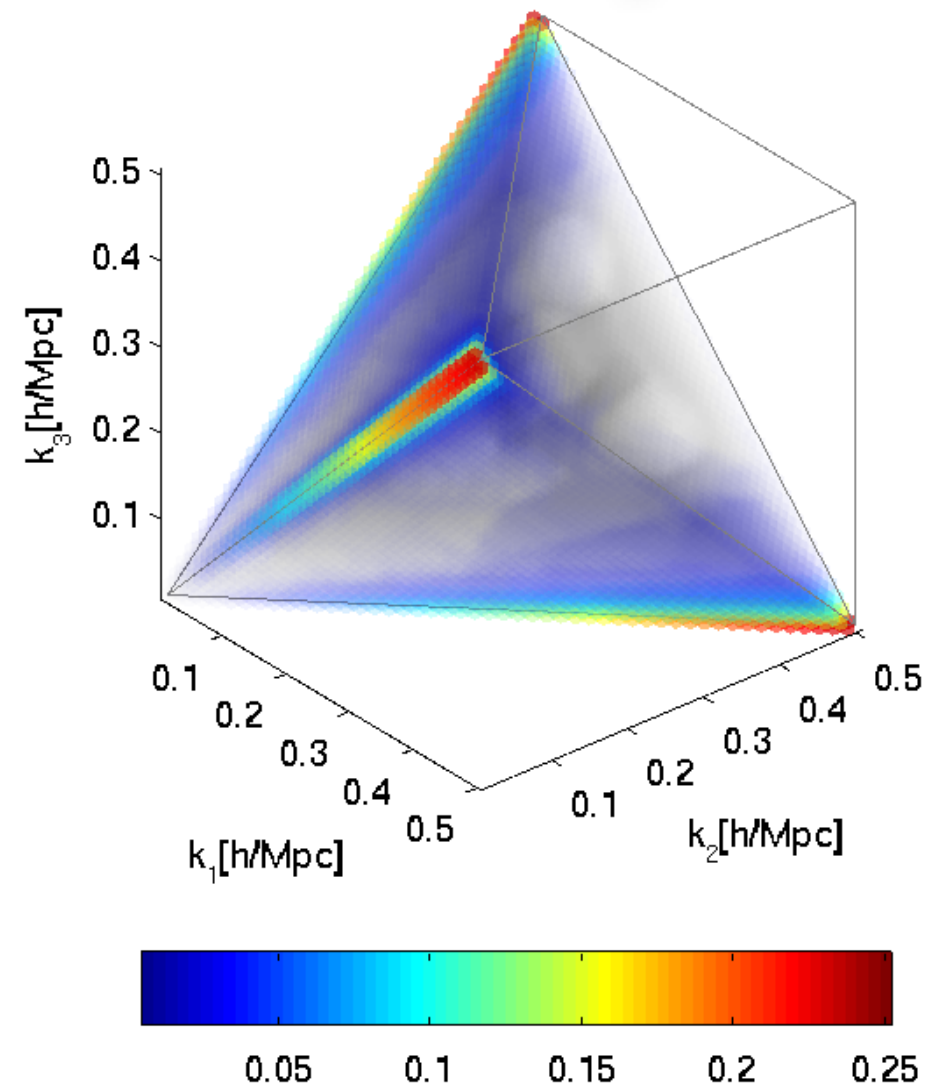
MS, Regan, Shellard 1207.5678

$z=30$

*Tree level theory*



*N-body*



Plot  $S/N$  weighted **excess** bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

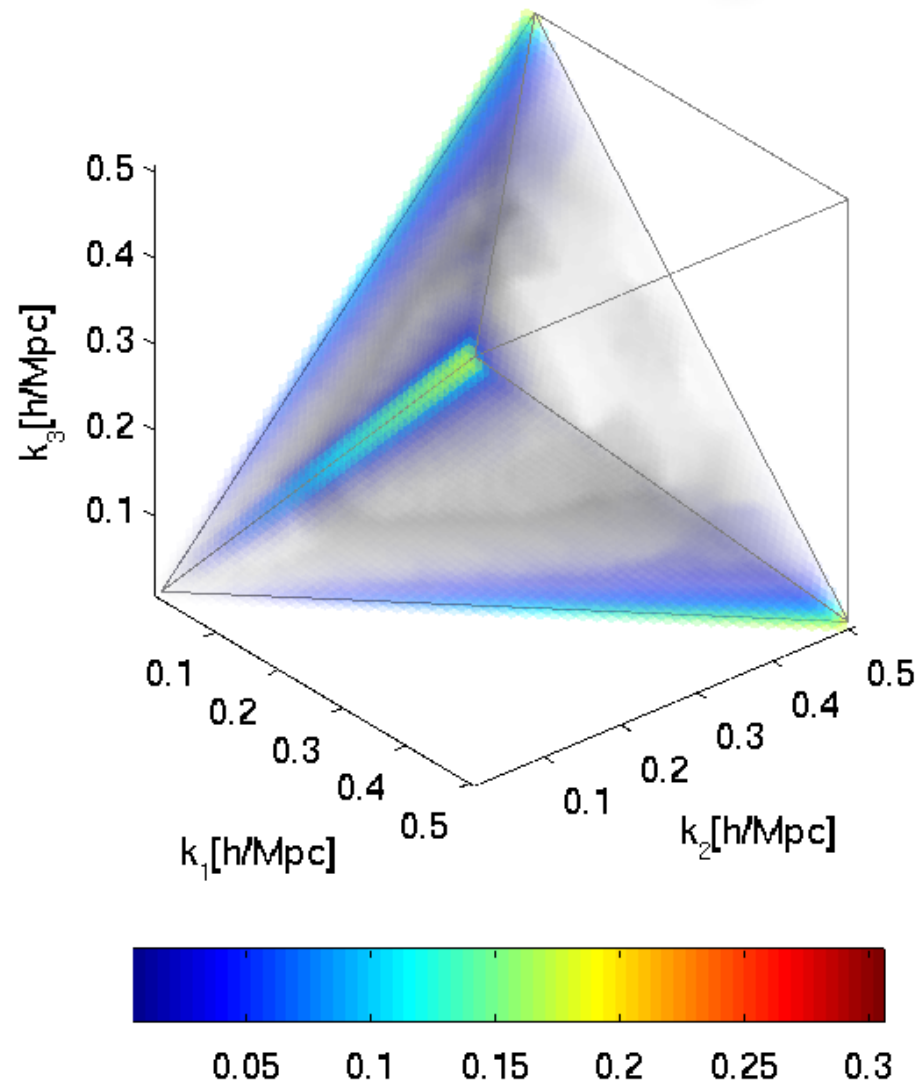
3 realisations of  $512^3$  particles in a  $L = 1600$  Mpc/ $h$  box with  $z_{\text{init}} = 49$  and  $k = 0.004$ - $0.5$  h/Mpc,  $f_{\text{NL}}=10$

# LOCAL NON-GAUSSIAN SIMS

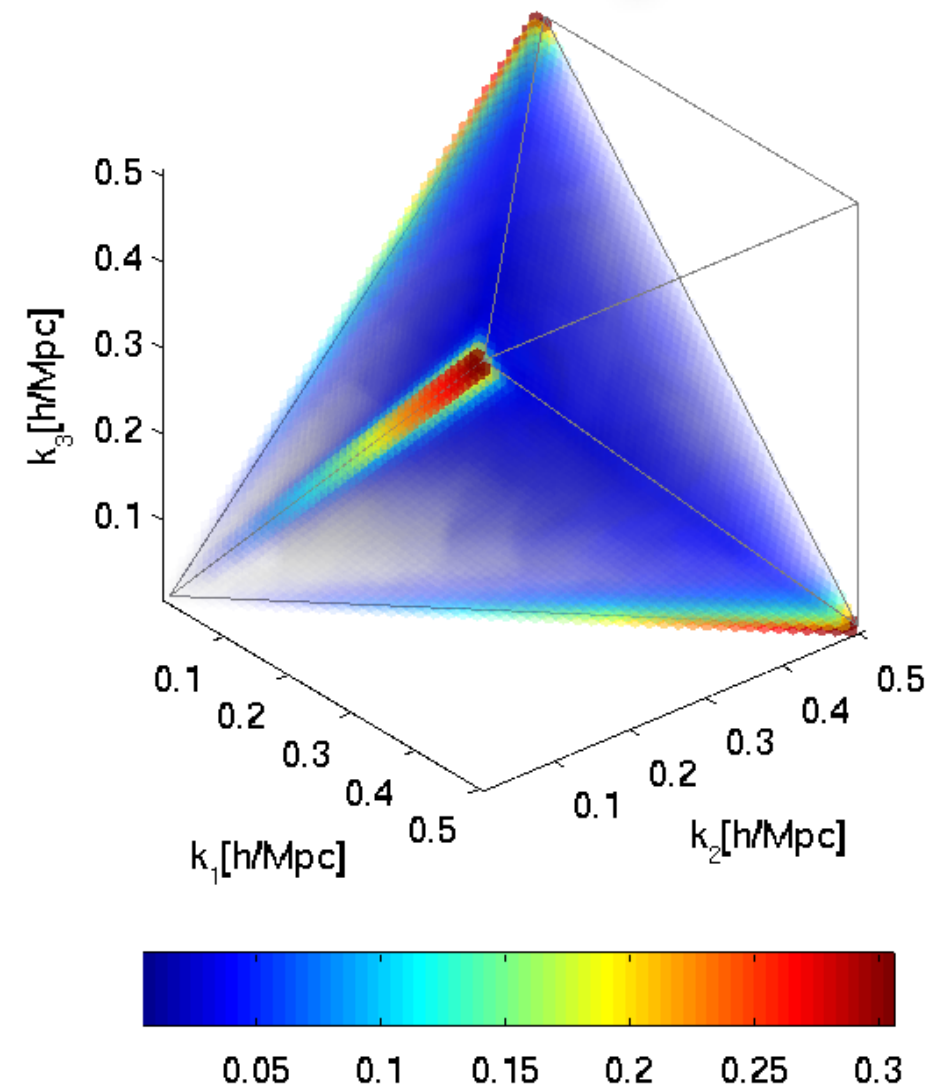
MS, Regan, Shellard 1207.5678

$z=2$

*Tree level theory*



*N-body*



Plot  $S/N$  weighted **excess** bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

3 realisations of  $512^3$  particles in a  $L = 1600$  Mpc/ $h$  box with  $z_{\text{init}} = 49$  and  $k = 0.004$ - $0.5$  h/Mpc,  $f_{\text{NL}}=10$

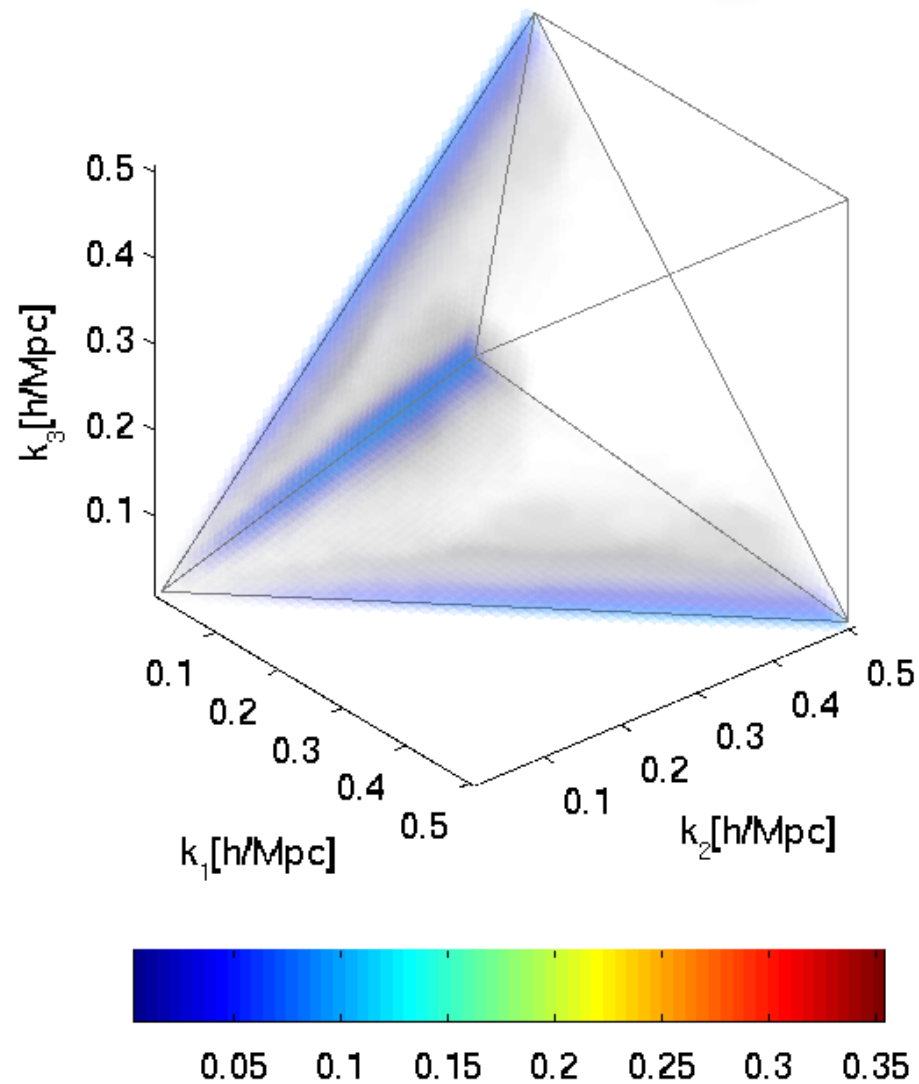


# LOCAL NON-GAUSSIAN SIMS

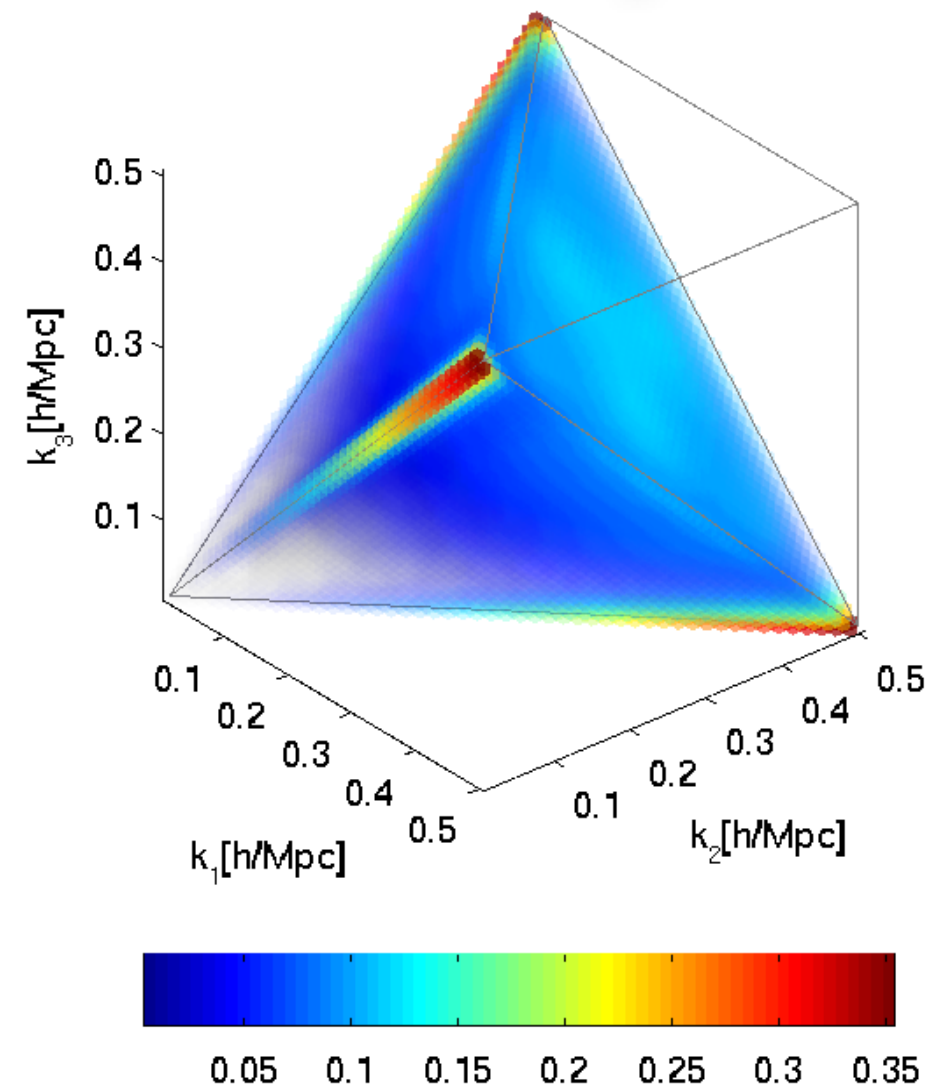
MS, Regan, Shellard 1207.5678

$z=0$

*Tree level theory*



*N-body*



Plot  $S/N$  weighted **excess** bispectrum  $\sqrt{k_1 k_2 k_3} B_\delta(k_1, k_2, k_3) / \sqrt{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$

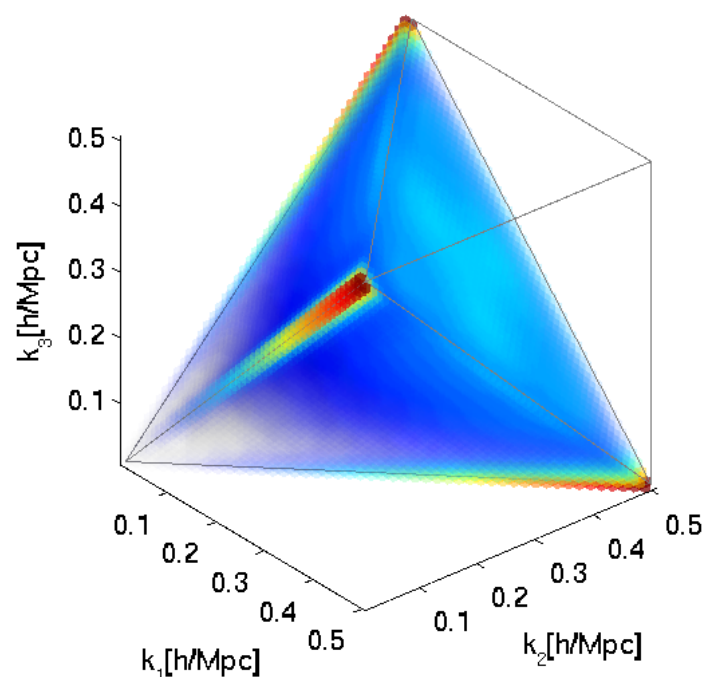
3 realisations of  $512^3$  particles in a  $L = 1600$  Mpc/ $h$  box with  $z_{\text{init}} = 49$  and  $k = 0.004-0.5$  h/Mpc,  $f_{\text{NL}}=10$

# OTHER SHAPES

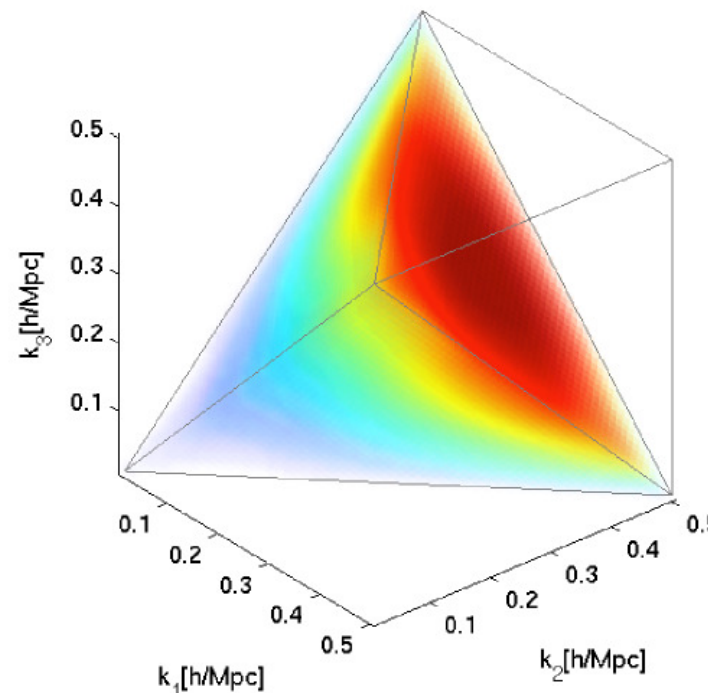
MS, Regan, Shellard 1207.5678

## ► Excess DM bispectra for other non-Gaussian initial conditions

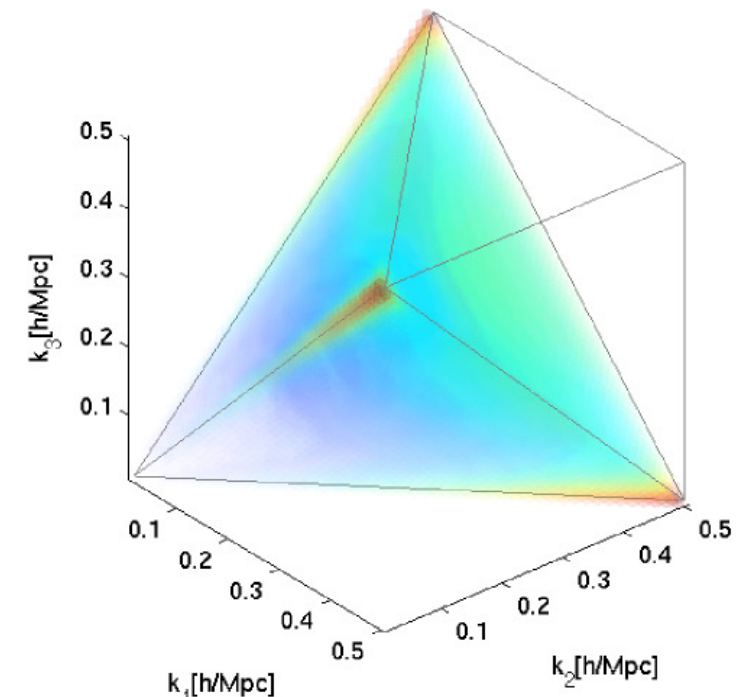
multiple fields  
(local)



higher derivatives  
(equilateral)



non-standard vacuum  
(flattened)



$z=0, k_{\max}=0.5h\text{Mpc}^{-1}, 512^3$  particles

Non-linear regime:

- Tree level shape is enhanced by non-linear power spectrum
- Additional  $\sim$ constant contribution to bispectrum signal
- Quantitative characterisation with cumulative  $S/N$  and 3d shape correlations in 1207.5678



# SIMILARITY OF SHAPES

Babich et al. 2004, Fergusson, Regan, Shellard 2010

Introduce **scalar product**  $\langle \cdot, \cdot \rangle_{\text{est}}$ , **shape correlation**  $\mathcal{C}$  and **norm**  $||B||$

$$\langle B_i, B_j \rangle_{\text{est}} \equiv \frac{V}{\pi} \int_{\mathcal{V}_B} dk_1 dk_2 dk_3 \frac{k_1 k_2 k_3 B_i(k_1, k_2, k_3) B_j(k_1, k_2, k_3)}{P_\delta(k_1) P_\delta(k_2) P_\delta(k_3)}$$

$$\mathcal{C}(B_i, B_j) \equiv \frac{\langle B_i, B_j \rangle_{\text{est}}}{\sqrt{\langle B_i, B_i \rangle_{\text{est}} \langle B_j, B_j \rangle_{\text{est}}}} \in [-1, 1]$$

if  $|\mathcal{C}(B_1, B_2)| \ll 1$  then  
estimator for  $B_1$  cannot  
find any  $B_2$  and vice versa

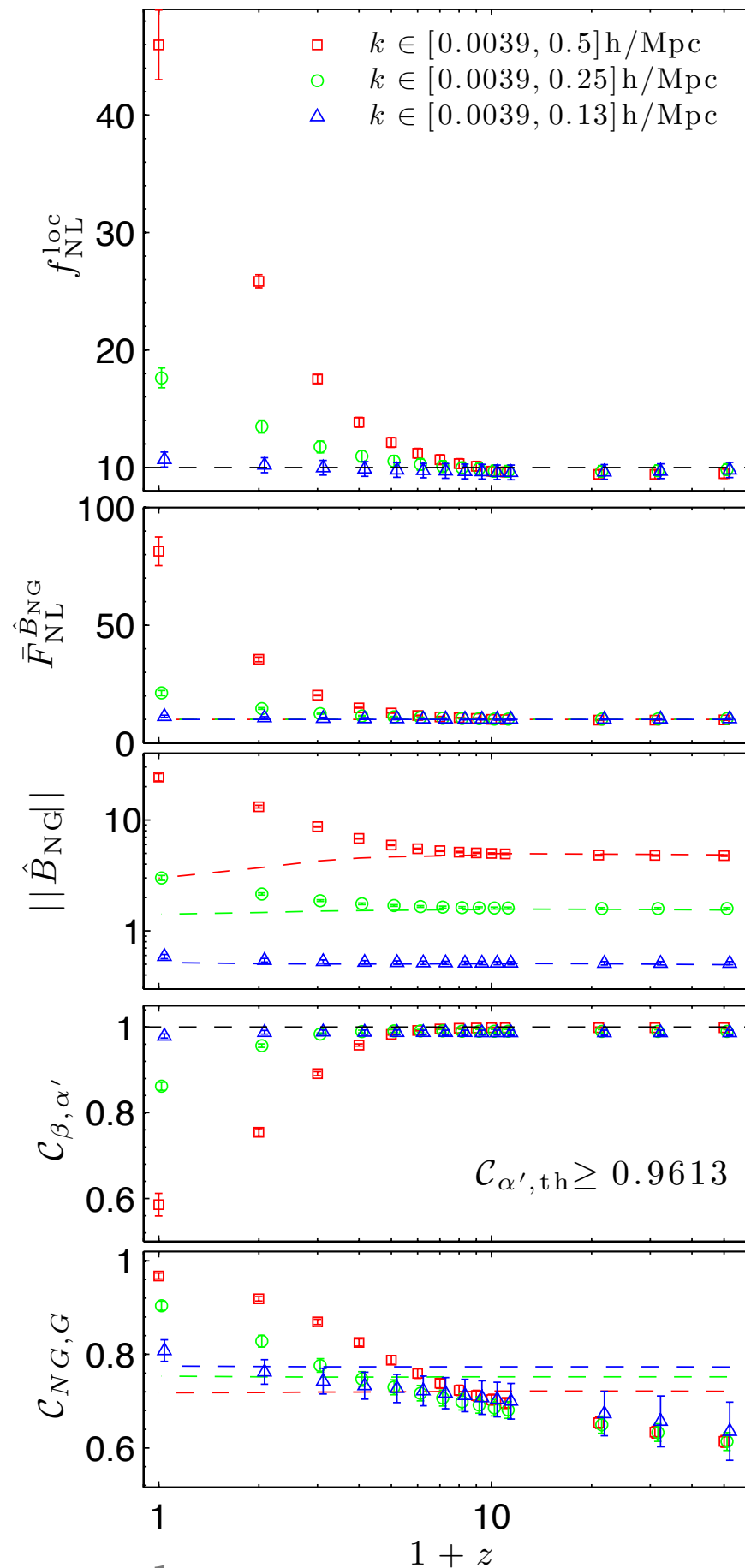
$$||B|| \equiv \sqrt{\langle B, B \rangle_{\text{est}}} \quad \text{total integrated S/N}$$

$$\Rightarrow \langle \hat{f}_{\text{NL}}^{B^{\text{theo}}} \rangle = \mathcal{C}(B_\delta^{\text{data}}, B_\delta^{\text{theo}}) \frac{||B_\delta^{\text{data}}||}{||B_\delta^{\text{theo}}||} \quad \text{projection of data on theory}$$

NG initial  
conditions with

$$f_{\text{NL}}^{\text{local}} = 10$$

- $k \in [0.0039, 0.5] \text{ h/Mpc}$
- $k \in [0.0039, 0.25] \text{ h/Mpc}$
- △  $k \in [0.0039, 0.13] \text{ h/Mpc}$



$B_{\text{local}}^{\text{theo}}$   
 $\hat{f}_{\text{NL}}^{\text{local}}$   $\left\{ \begin{array}{l} \text{vertical arrow} \\ \text{diagonal arrow} \end{array} \right.$   $\hat{B}_{\text{NG}}$

$B_{\text{local}}^{\text{theo}}$   
 $\hat{B}_{\text{NG}}$   
 $||B|| \propto \bar{F}_{\text{NL}}$

$B_{\text{local}}^{\text{theo}}$   
 $\hat{B}_{\text{NG}}$   
 $\mathcal{C}(\hat{B}_{\text{NG}}, B_{\text{local}})$

$\hat{B}_{\text{Gauss}}$   
 $\hat{B}_{\text{NG}}$   
 $\mathcal{C}(\hat{B}_{\text{NG}}, \hat{B}_{\text{Gauss}})$



# TIME SHIFT MODEL

MS, Regan, Shellard 1207.5678

## ► Time shift model

- Non-Gaussian universe evolves slightly faster (or slower) than Gaussian universe
- Halos form earlier (later) in presence of primordial non-Gaussianity
- Primordial non-Gaussianity gives growth of the 1-halo bispectrum a 'headstart' (or delay)

*Non-Gaussian universe*



=

*Gaussian universe*



- Motivates simple form of non-Gaussian excess bispectrum:

$$B_{\delta}^{\text{NG}} = \underbrace{\sqrt{\frac{P_{\delta}^{\text{NL}}(k_1)P_{\delta}^{\text{NL}}(k_2)P_{\delta}^{\text{NL}}(k_3)}{P_{\Phi}(k_1)P_{\Phi}(k_2)P_{\Phi}(k_3)}} B_{\Phi}(k_1, k_2, k_3)}_{\text{perturbative with non-linear power}} + \underbrace{c\Delta z \partial_z [D^{n_h}(z)](k_1 + k_2 + k_3)^{\nu}}_{\text{time shifted 1-halo term}}$$

See Valageas for similar philosophy in Gaussian case (combing PT+halo model)

# FITTING FORMULAE

MS, Regan, Shellard 1207.5678

## ► Simple fitting formulae for grav. and primordial DM bispectrum shapes

- Valid at  $0 \leq z \leq 20$ ,  $k \leq 2h\text{Mpc}^{-1}$

3d shape correlation with measured shapes is  $\geq 94.4\%$  at  $0 \leq z \leq 20$  and  $\geq 98\%$  at  $z=0$   
( $\geq 99.8\%$  for gravity at  $0 \leq z \leq 20$ )

- Only  $\sim 3$  free parameters per inflation model (local, equilateral, flattened, [orthogonal])

$$B_{\delta}^{\text{NG}} = \underbrace{\sqrt{\frac{P_{\delta}^{\text{NL}}(k_1)P_{\delta}^{\text{NL}}(k_2)P_{\delta}^{\text{NL}}(k_3)}{P_{\Phi}(k_1)P_{\Phi}(k_2)P_{\Phi}(k_3)}} B_{\Phi}(k_1, k_2, k_3)}_{\text{perturbative with non-linear power}} + \underbrace{c\Delta z \partial_z [D^{n_h}(z)](k_1 + k_2 + k_3)^{\nu}}_{\text{time shifted 1-halo term}} \leftarrow \nu \approx -1.7$$

Simulation	$L[\frac{\text{Mpc}}{h}]$	$c_{1,2}$	$n_h^{(\text{prim})}$	Quality of fit:	
				all $z$	$z=0$
G512g	1600	$4.1 \times 10^6$	7	99.8%	99.8%
Loc10	1600	$2 \times 10^3$	6	99.7%	99.8%
Eq100	1600	$8.6 \times 10^2$	6	97.9%	99.4%
Flat10	1600	$1.2 \times 10^4$	6	98.8%	98.9%
G <sub>400</sub> <sup>512</sup>	400	$1.0 \times 10^7$	8	99.8%	99.8%
Loc10 <sub>400</sub> <sup>512</sup>	400	$2 \times 10^3 dD/da$	7	98.2%	99.0%
Eq100 <sub>400</sub> <sup>512</sup>	400	$8.6 \times 10^2 dD/da$	7	94.4%	97.9%
Flat10 <sub>400</sub> <sup>512</sup>	400	$1.2 \times 10^4 dD/da$	7	97.7%	99.1%
Orth100 <sub>400</sub> <sup>512</sup>	400	$-2.6 \times 10^2$	6.5	97.3%	98.9%

Overall amplitude needs to be rescaled by (poorly understood) time-dependent prefactor; extends Gil-Marín *et al* formula to smaller scales and NG ICs



# CONCLUSIONS

## Conclusions

- ▶ Efficient and general non-Gaussian N-body initial conditions
- ▶ Fast estimation of full bispectrum
  - ☑ new standard diagnostic alongside power spectrum
- ▶ Tracked time evolution of the DM bispectrum in a large suite of non-Gaussian N-body simulations
- ▶ Time shift model for effect of primordial non-Gaussianity
- ▶ New fitting formulae for gravitational and primordial DM bispectra

See 1108.3813 (initial conditions)  
1207.5678 (rest)



# PART II: JOINT ANALYSIS OF CMB TEMPERATURE AND LENSING-RECONSTRUCTION POWER SPECTRA

arXiv:1308.0286 (PRD 88 063012)

Collaborators

Anthony Challinor (IoA/DAMTP Cambridge)

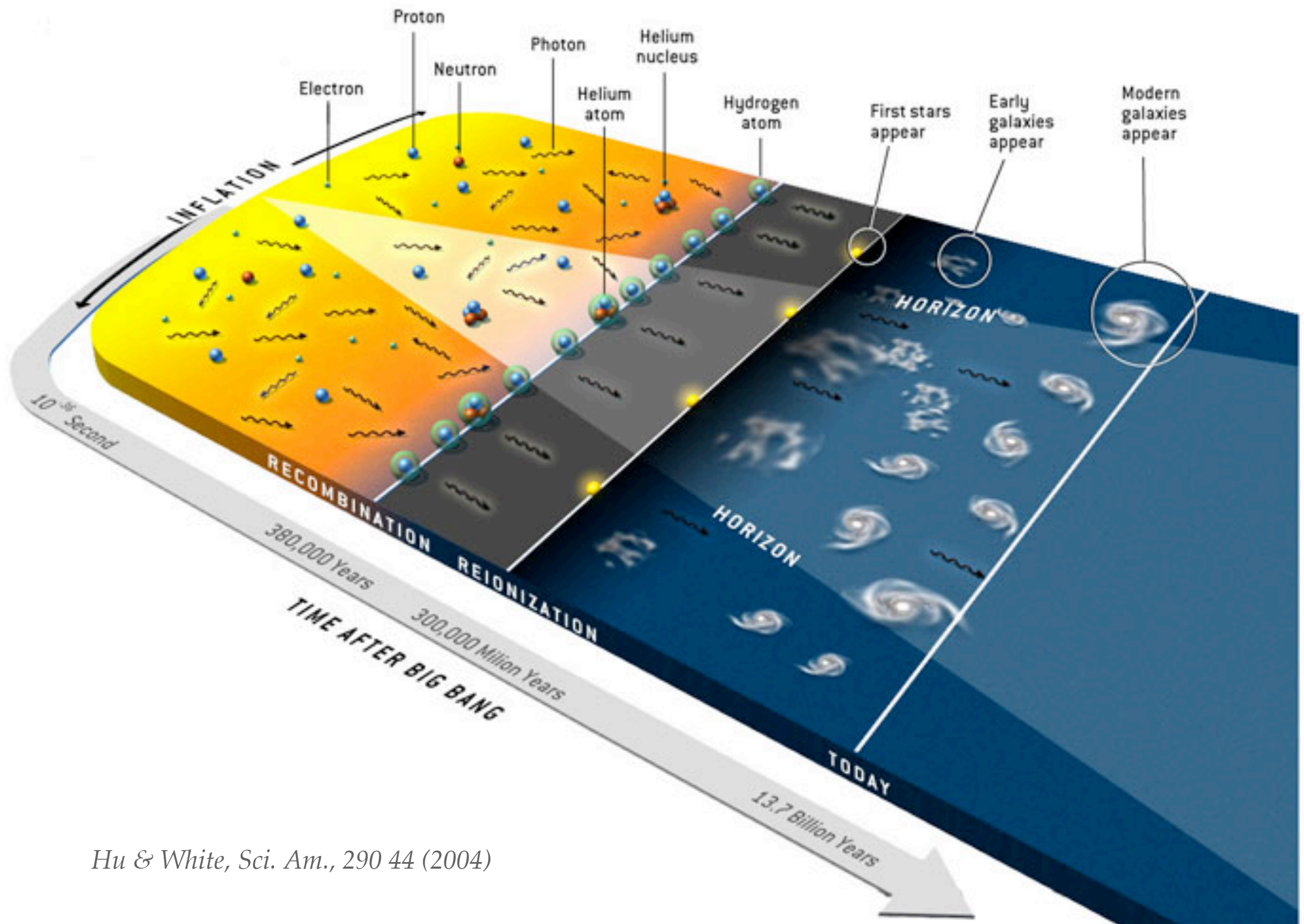
Duncan Hanson (McGill)

Antony Lewis (Sussex)

Berkeley 22 Oct 2013



# THE COSMIC MICROWAVE BACKGROUND (CMB) BASICS



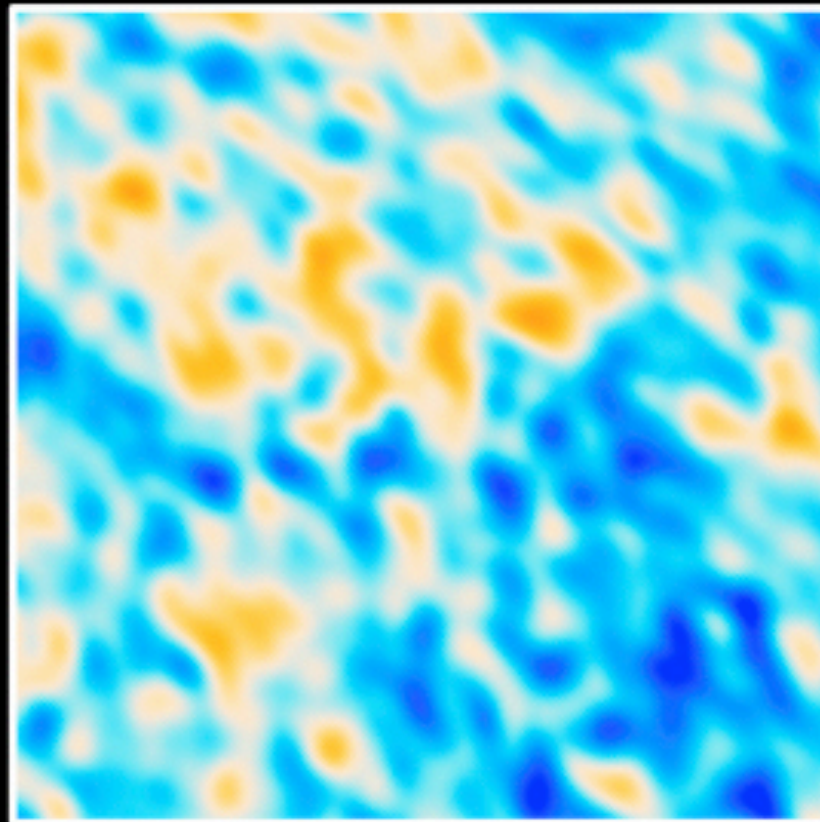
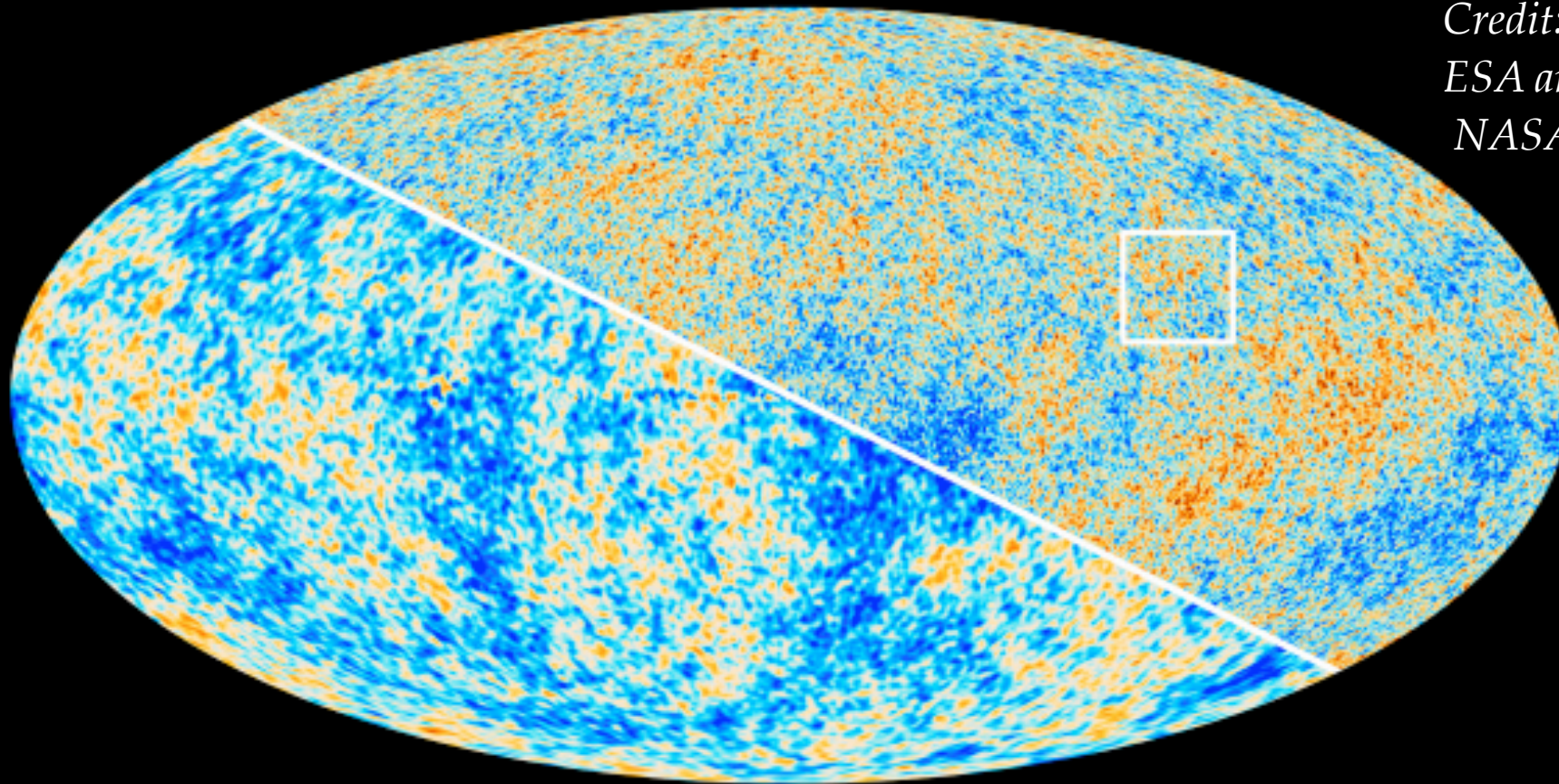
*Hu & White, Sci. Am., 290 44 (2004)*



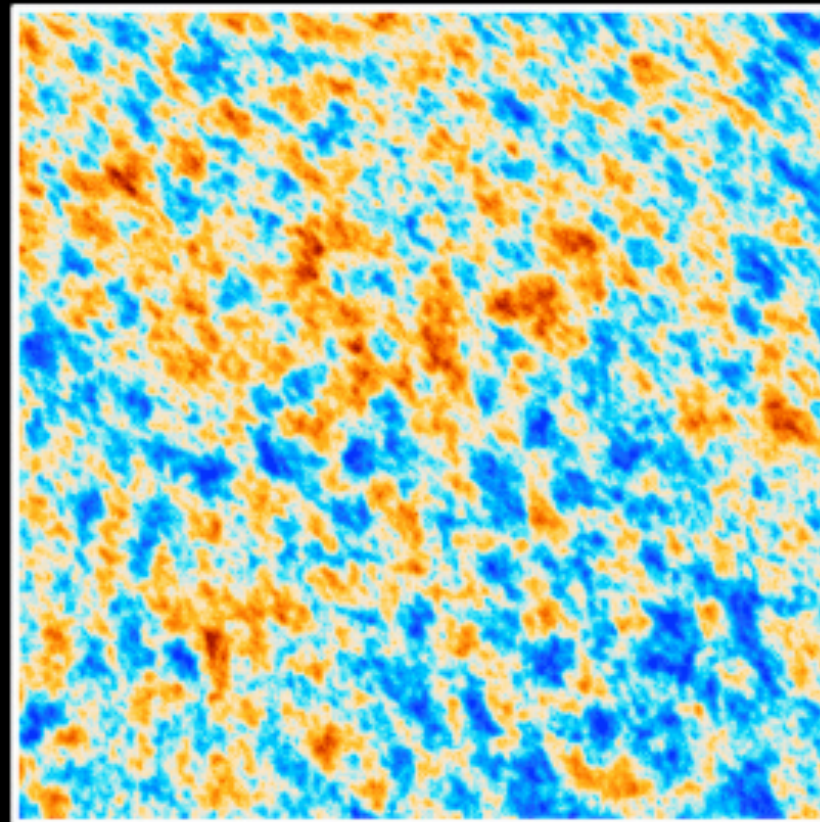
# *The Cosmic Microwave Background as seen by Planck and WMAP*

*Credit:*

*ESA and Planck Collaboration;  
NASA / WMAP Science Team*



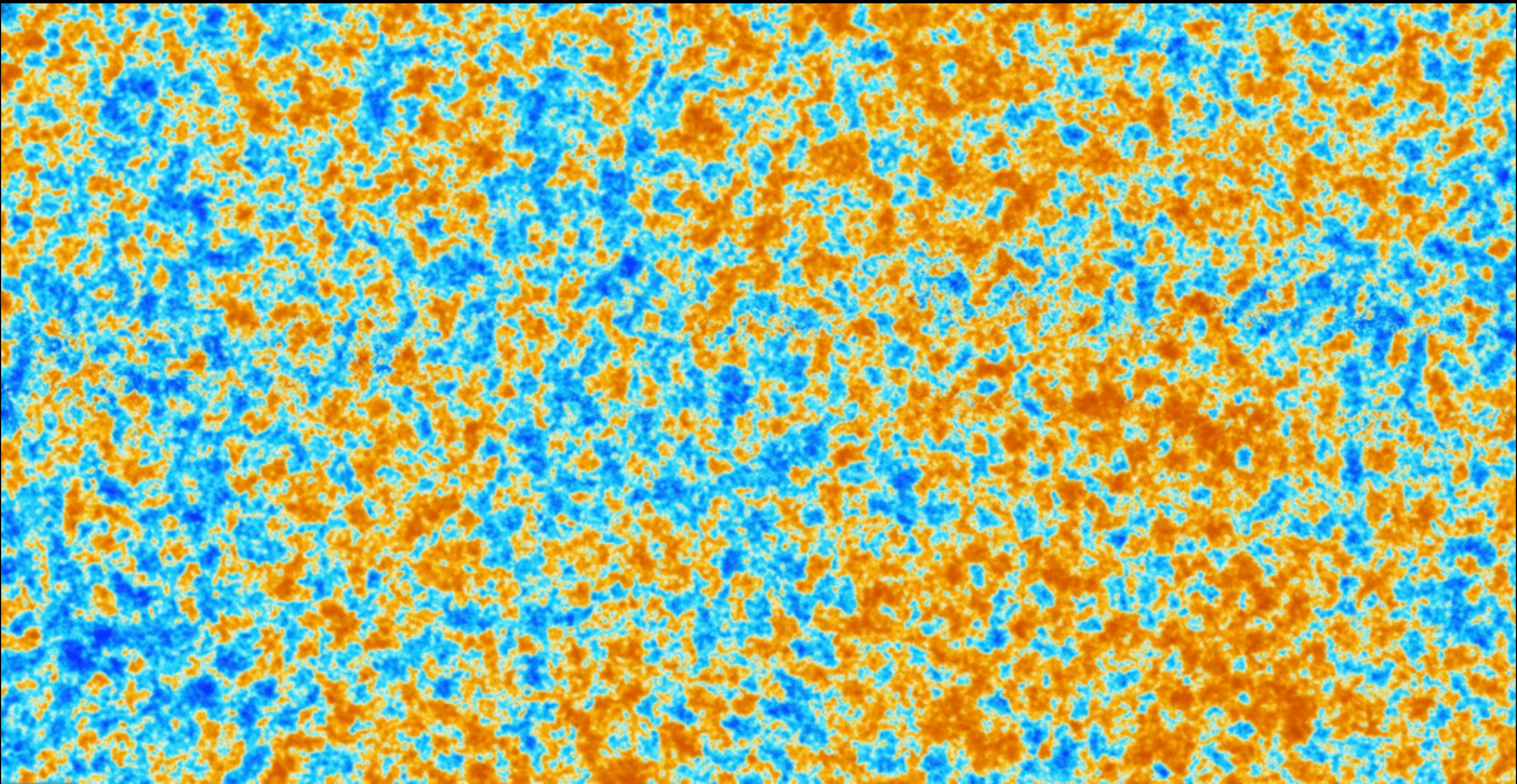
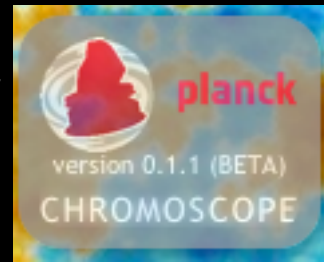
**WMAP**



**Planck**

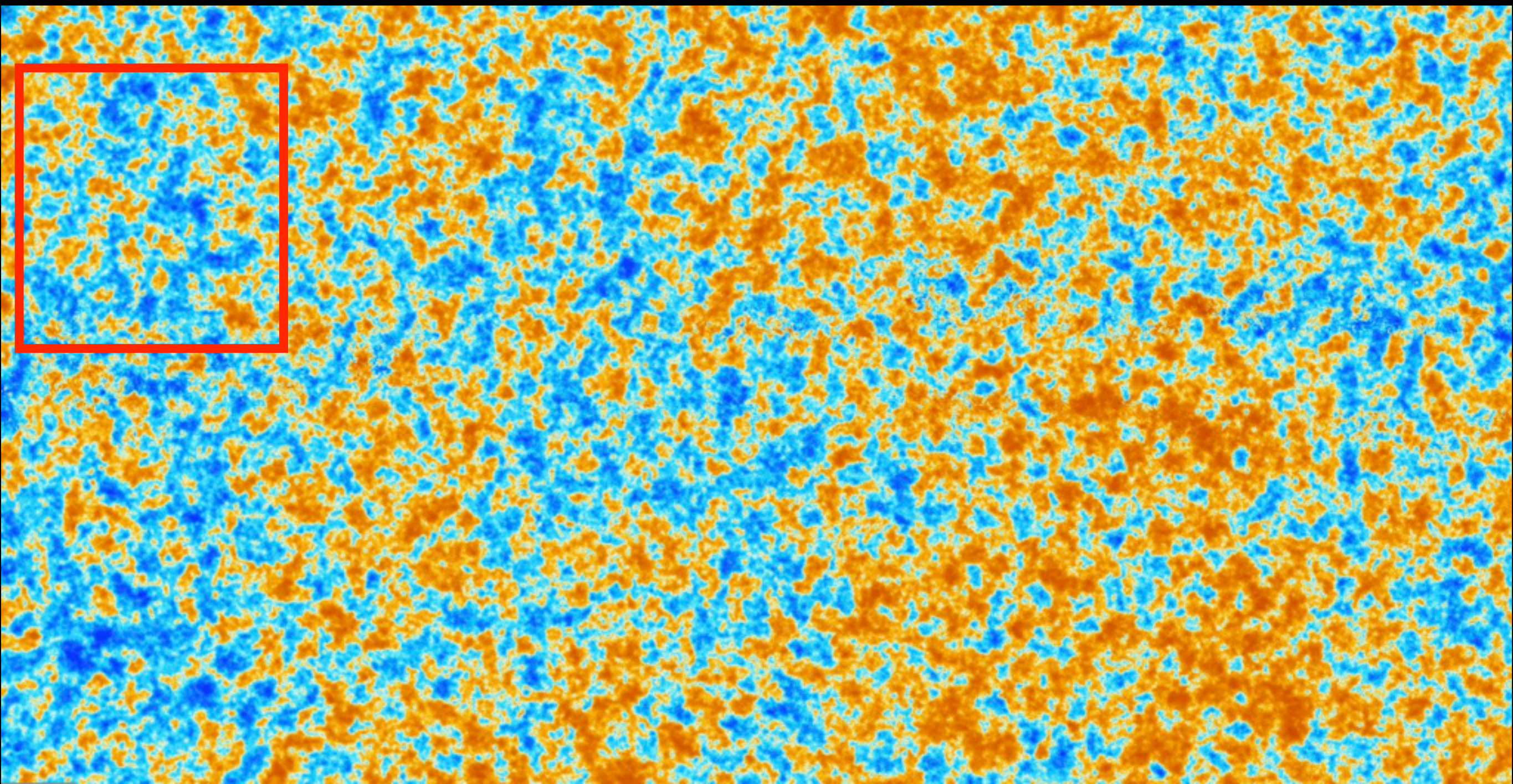
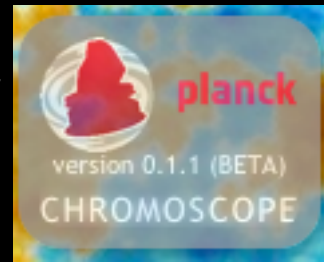


*Credit: Planck Chromoscope*  
*[http://astrog80.astro.cf.ac.uk/](http://astrog80.astro.cf.ac.uk/Planck/Chromoscope/)*  
*[Planck/Chromoscope/](http://astrog80.astro.cf.ac.uk/Planck/Chromoscope/)*  
*Chris North, Stuart Lowe*  
*ESA/Planck Collaboration;*  
*Paul Shellard*



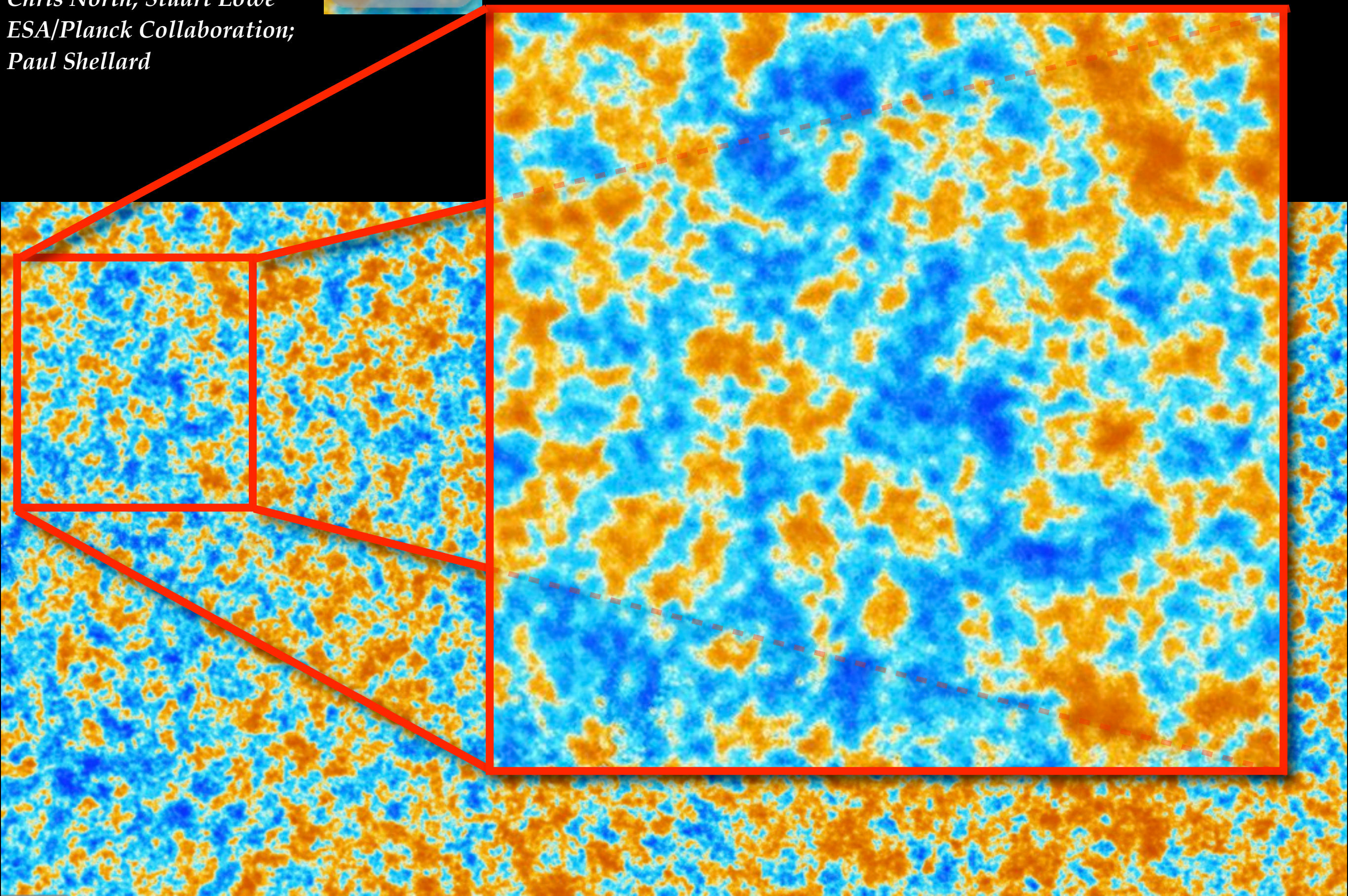
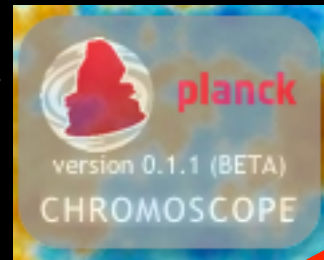


*Credit: Planck Chromoscope*  
*[http://astrog80.astro.cf.ac.uk/](http://astrog80.astro.cf.ac.uk/Planck/Chromoscope/)*  
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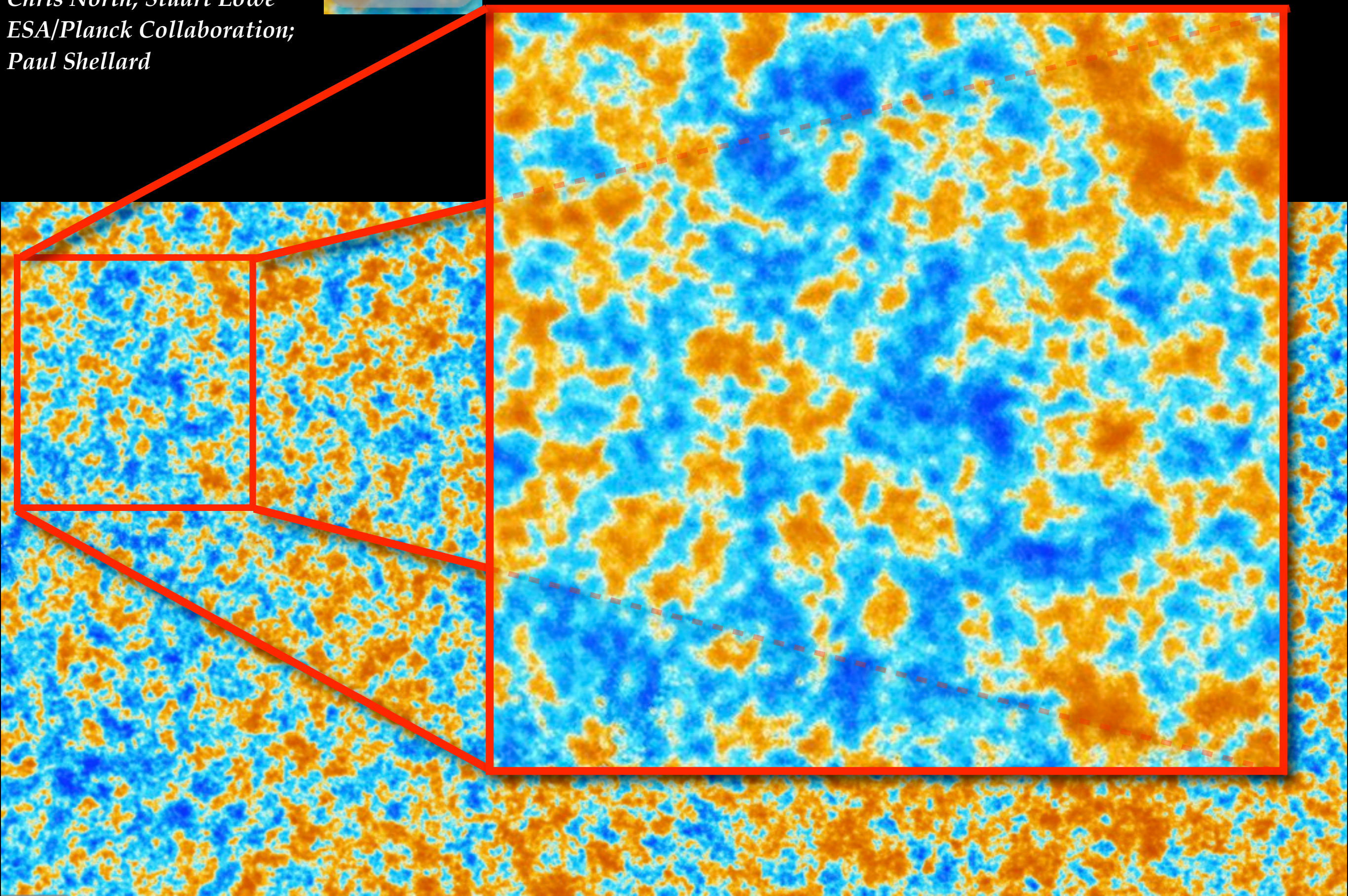
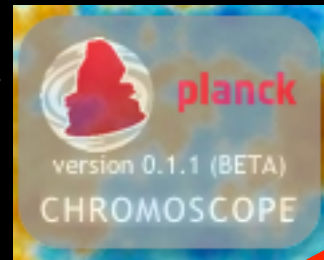


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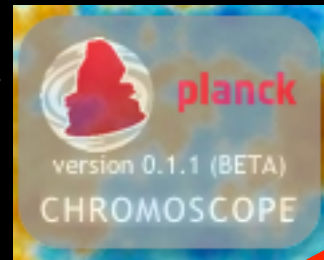


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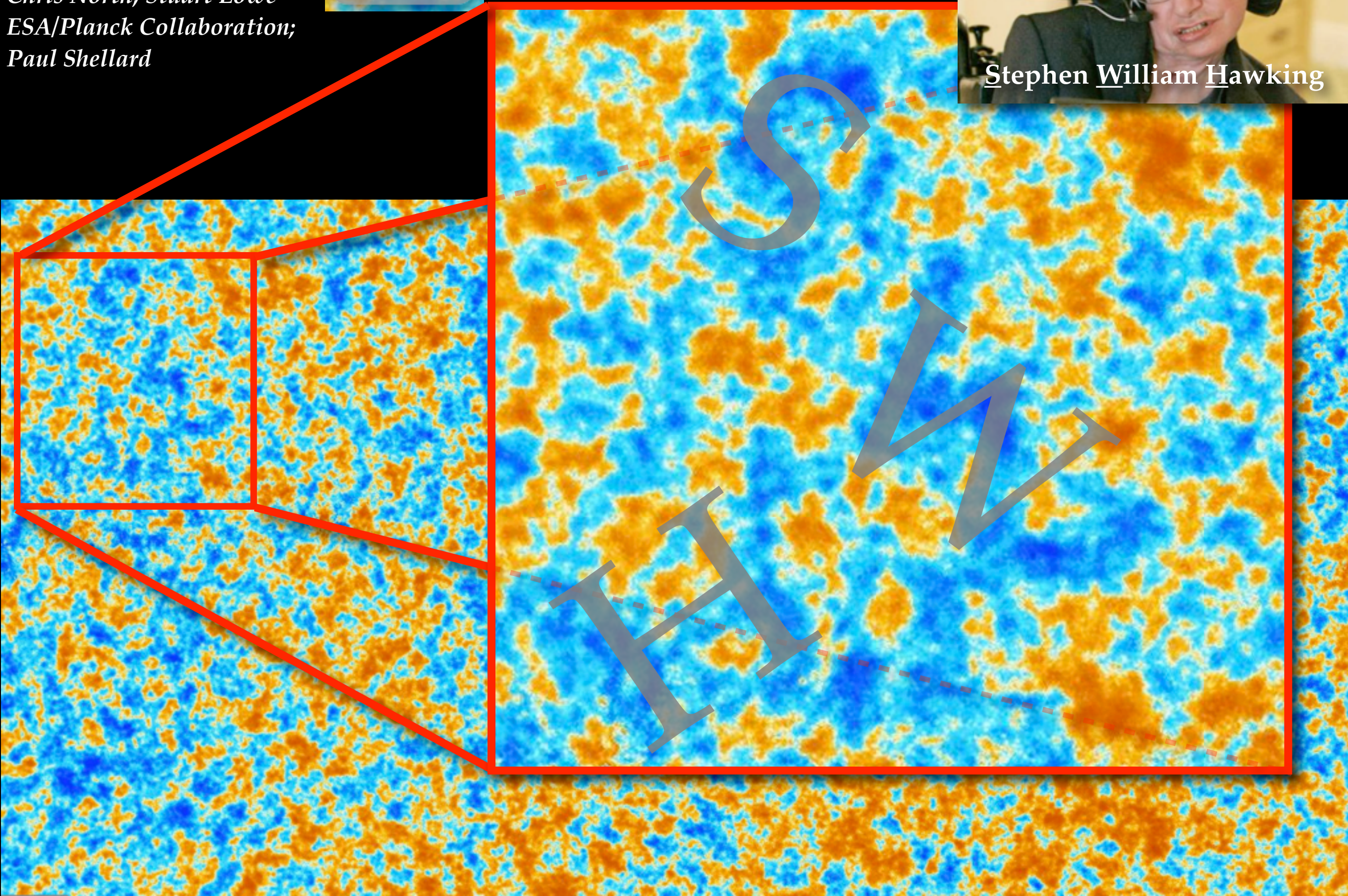




*Credit: Planck Chromoscope*  
*[http://astrog80.astro.cf.ac.uk/](http://astrog80.astro.cf.ac.uk/Planck/Chromoscope/)*  
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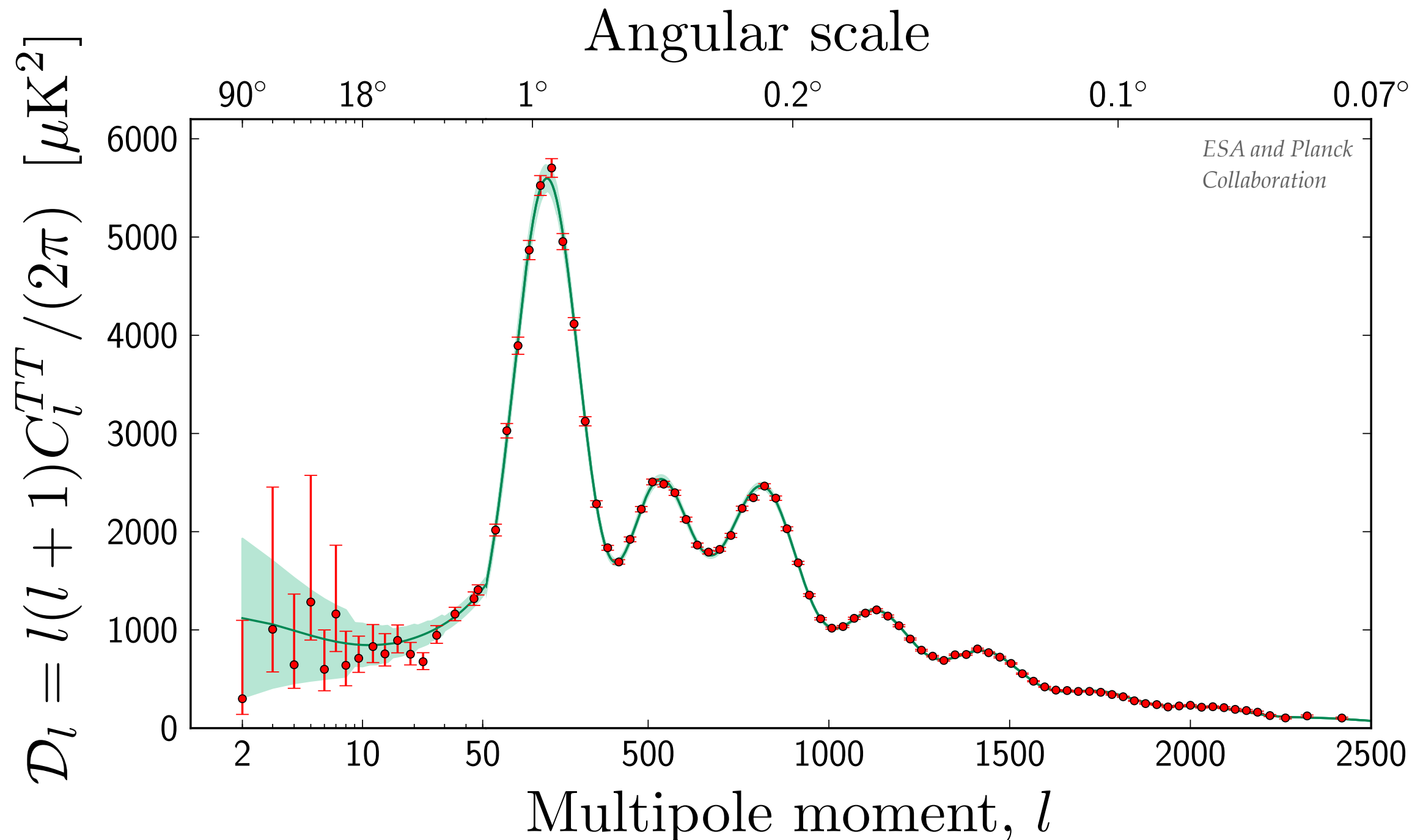
Stephen William Hawking





# THE COSMIC MICROWAVE BACKGROUND (CMB) BASICS

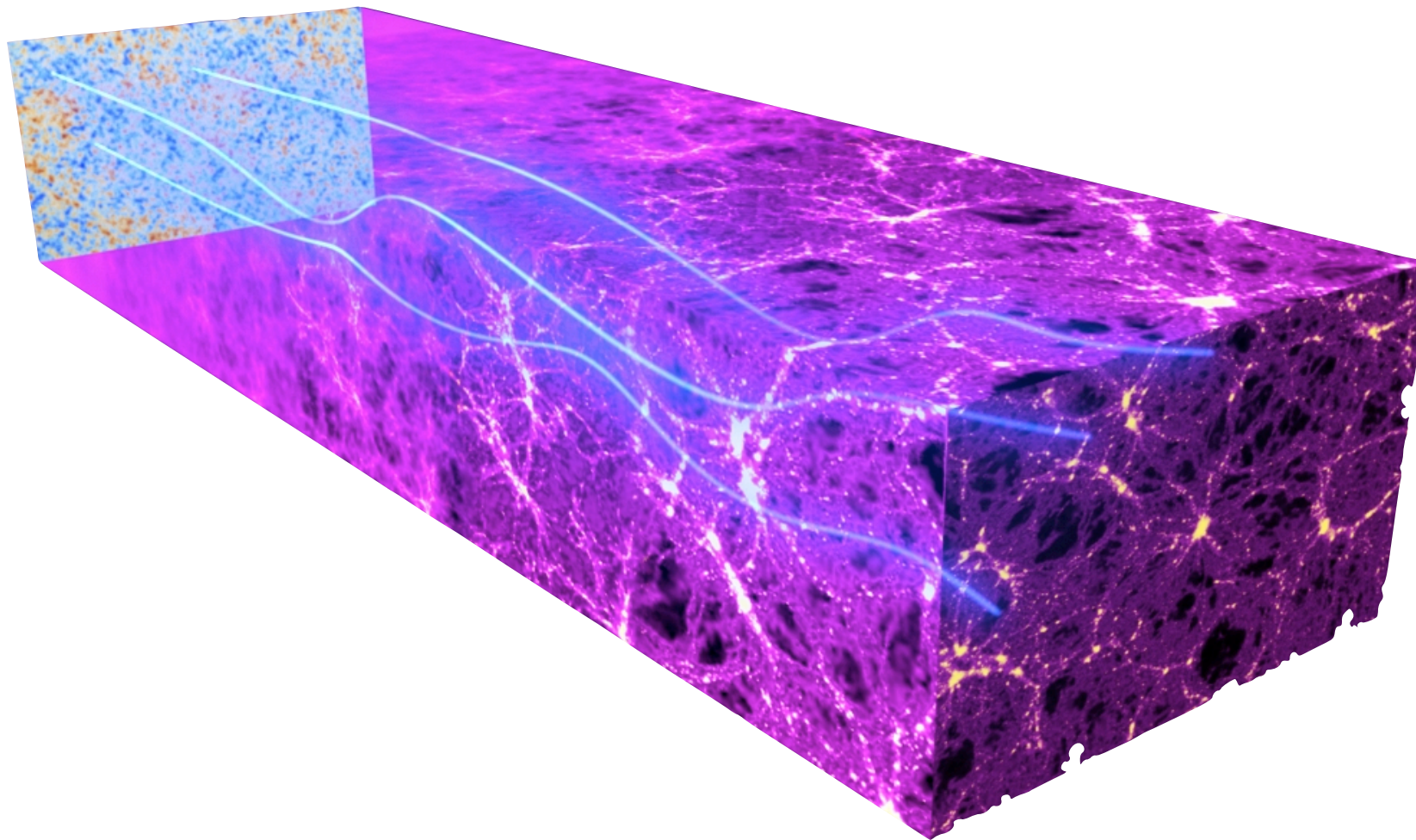
- Power spectrum (2-point correlation function in multipole space)





# CMB LENSING BASICS

- CMB photons are deflected by the inhomogeneous distribution of DM along the line of sight:



*ESA and Planck  
Collaboration*

- Deflection = gradient of **lensing potential**  $\phi$  (integral over matter perturbations along the line of sight)



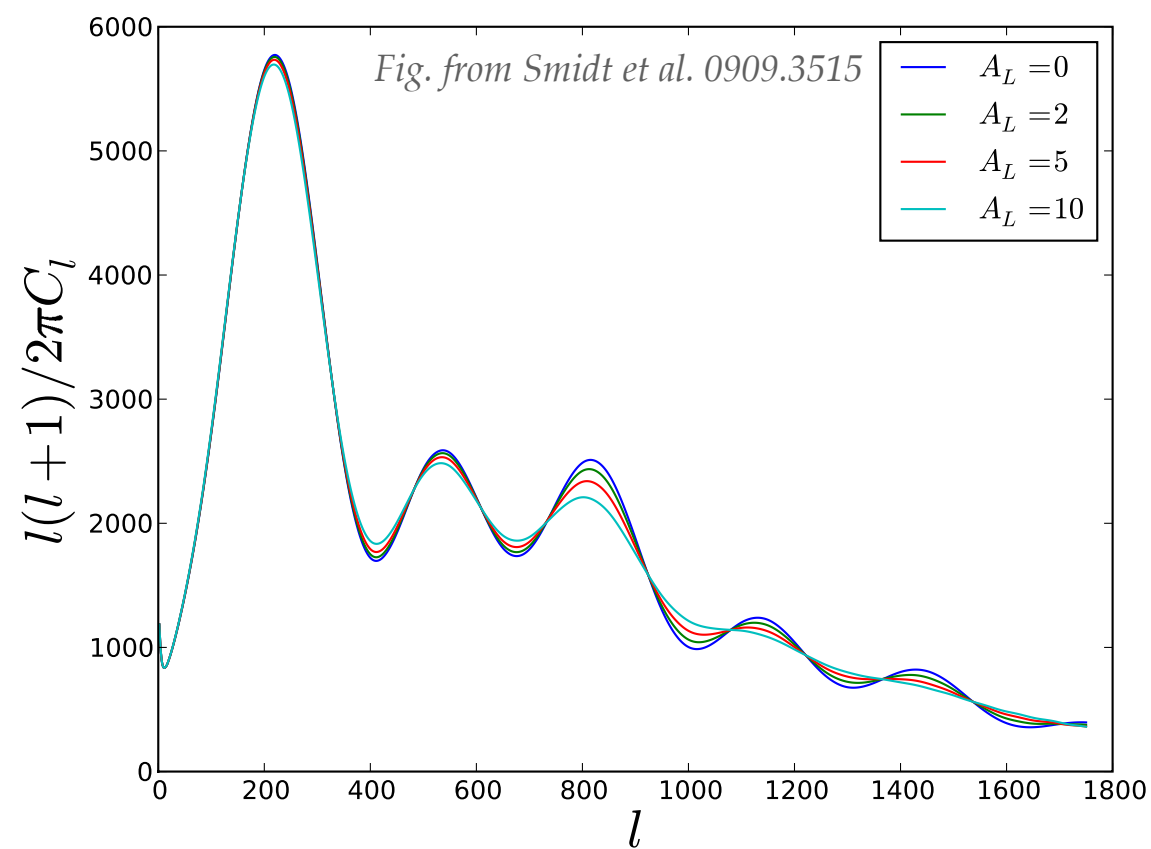
# CMB LENSING

## EFFECTS OF LENSING ON THE CMB

### (a) Smoothing CMB 2-point function

Acoustic peaks / troughs are smoothed out by lensing

(since lensed  $C^{\tilde{T}\tilde{T}}$  = convolution of unlensed  $C^{TT}$  and  $C^{\phi\phi}$ )





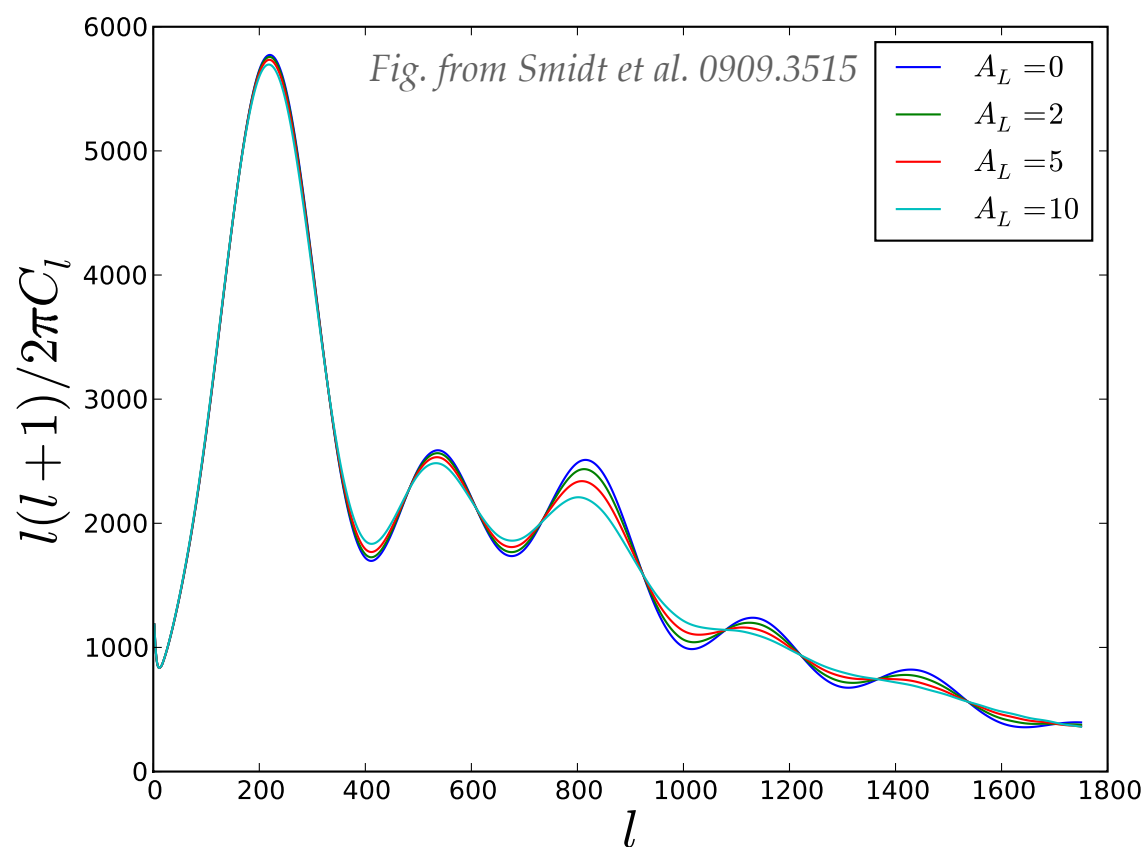
# CMB LENSING

## EFFECTS OF LENSING ON THE CMB

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### (b) Non-zero CMB 4-point function

For fixed realisation of **lenses**, the lensed temperature fluctuations are anisotropic

⇒ Mode coupling (off-diagonal covariance)

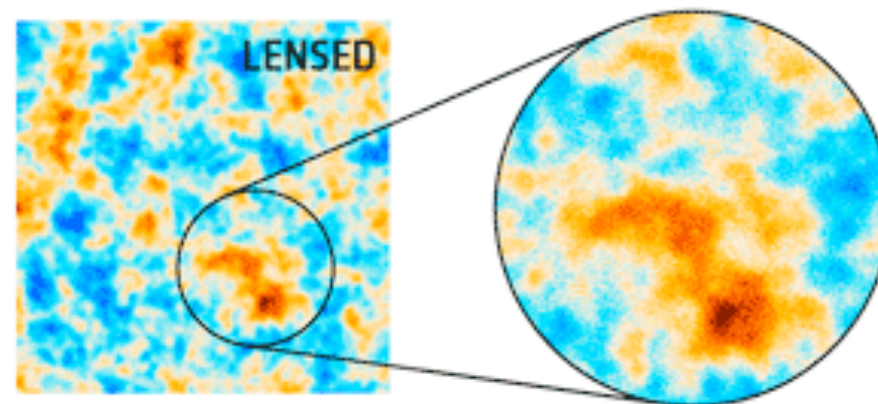
$$\langle \tilde{T}(\mathbf{l} + \mathbf{L}) \tilde{T}^*(\mathbf{l}) \rangle_{\text{CMB}} \propto \phi(\mathbf{L})$$

⇒ Reconstruct **lenses** from lensed  $\tilde{T}$

$$\hat{\phi}_{\text{rec}}(\mathbf{L}) \propto \int_1 \tilde{T}(\mathbf{l}) \tilde{T}^*(\mathbf{l} - \mathbf{L}) \times \text{weight}$$

⇒ Get **lensing power** from  $\tilde{T}$  trispectrum\*

$$\hat{C}_L^{\hat{\phi}_{\text{rec}} \hat{\phi}_{\text{rec}}} \propto \int_{\mathbf{l}, \mathbf{l}'} \tilde{T}(\mathbf{l}) \tilde{T}^*(\mathbf{l} - \mathbf{L}) \tilde{T}(-\mathbf{l}') \tilde{T}^*(\mathbf{L} - \mathbf{l}')$$



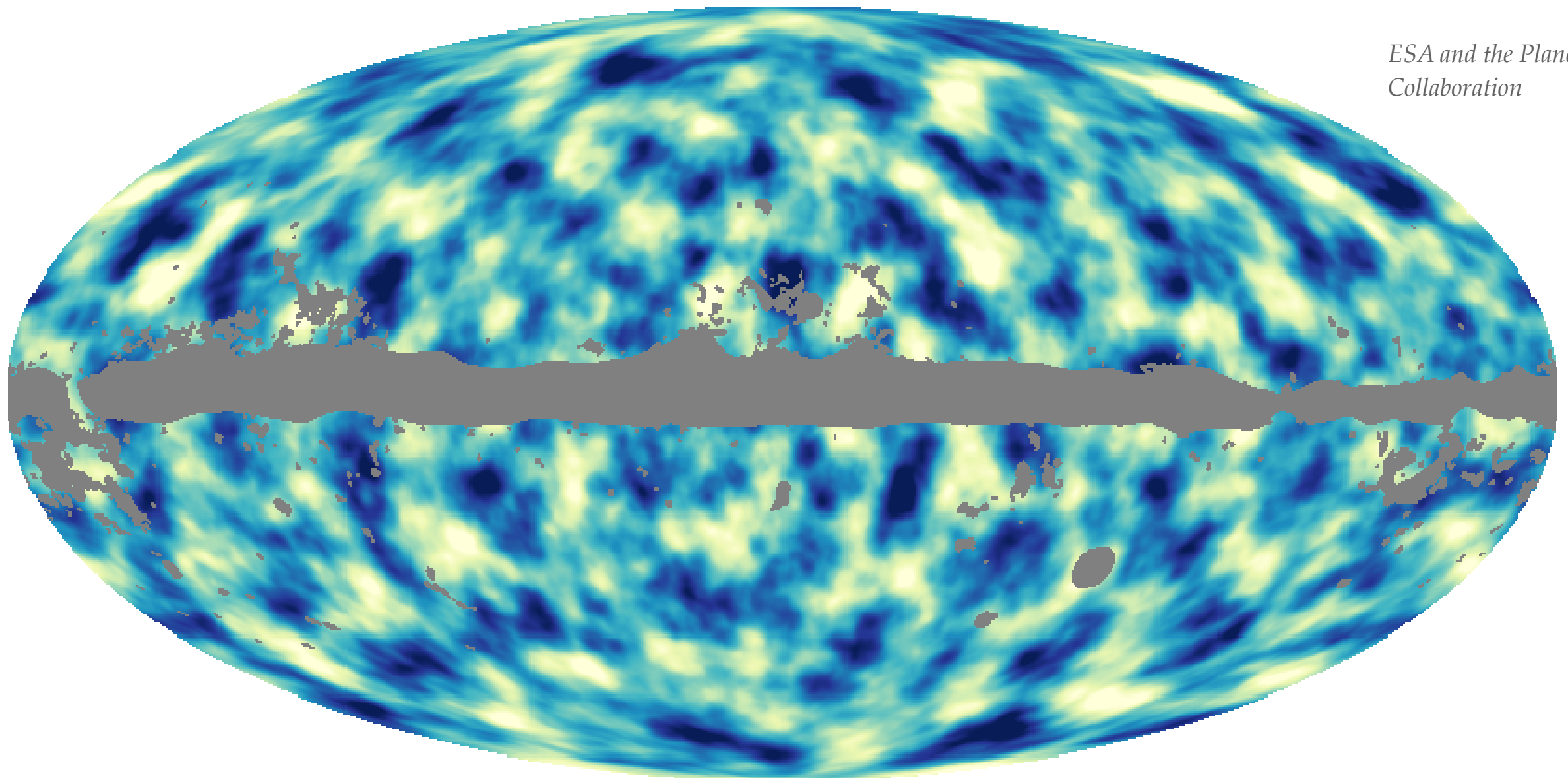
ESA and Planck  
Collaboration

\* All quadrilaterals whose diagonal has length  $L$



# CMB LENSING PLANCK RECONSTRUCTION

- Reconstructed mass map

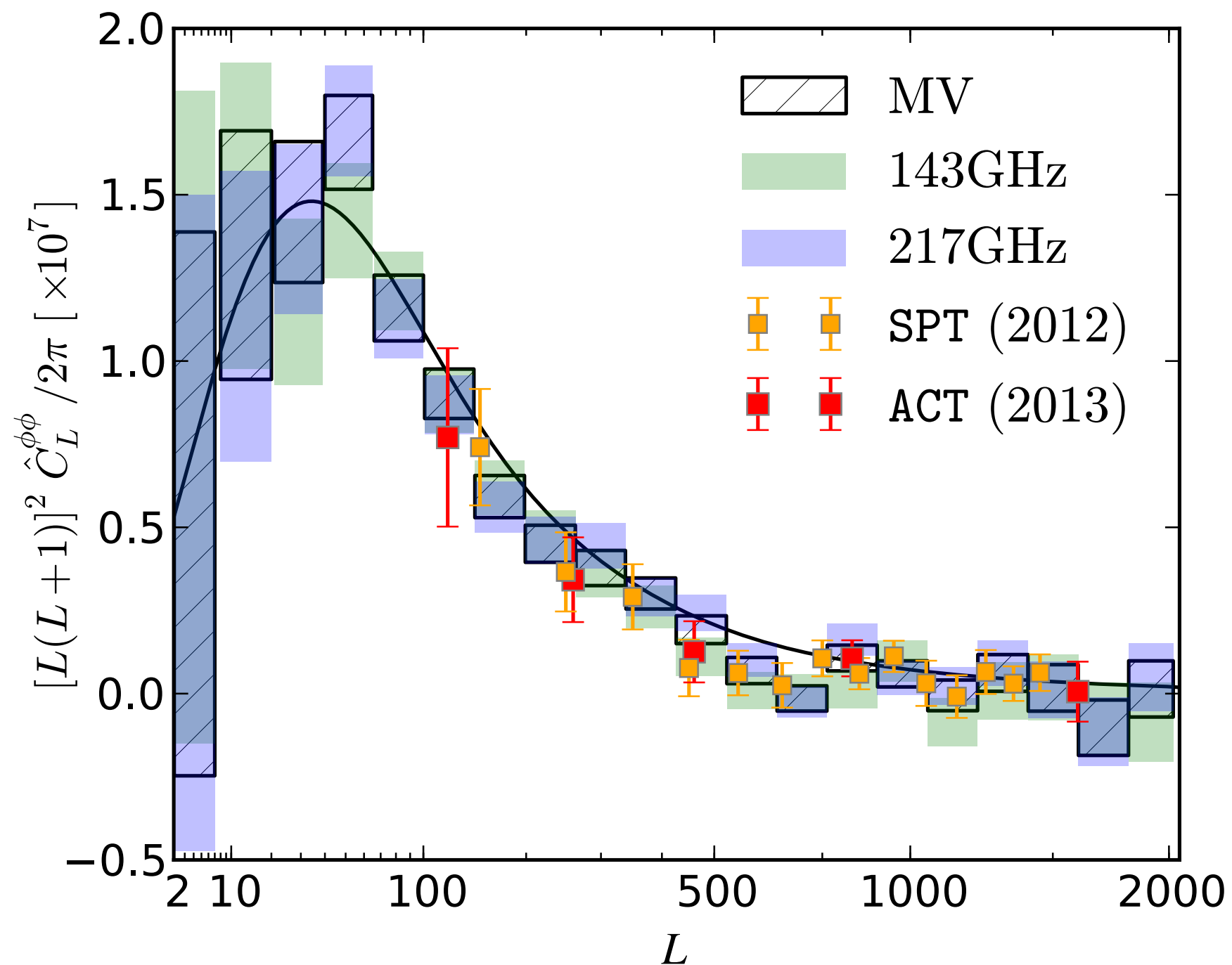


*ESA and the Planck  
Collaboration*



# CMB LENSING PLANCK RECONSTRUCTION

- Power spectrum of the deflection field



ESA and the Planck  
Collaboration



# CMB LENSING MOTIVATION

## Why do we care?

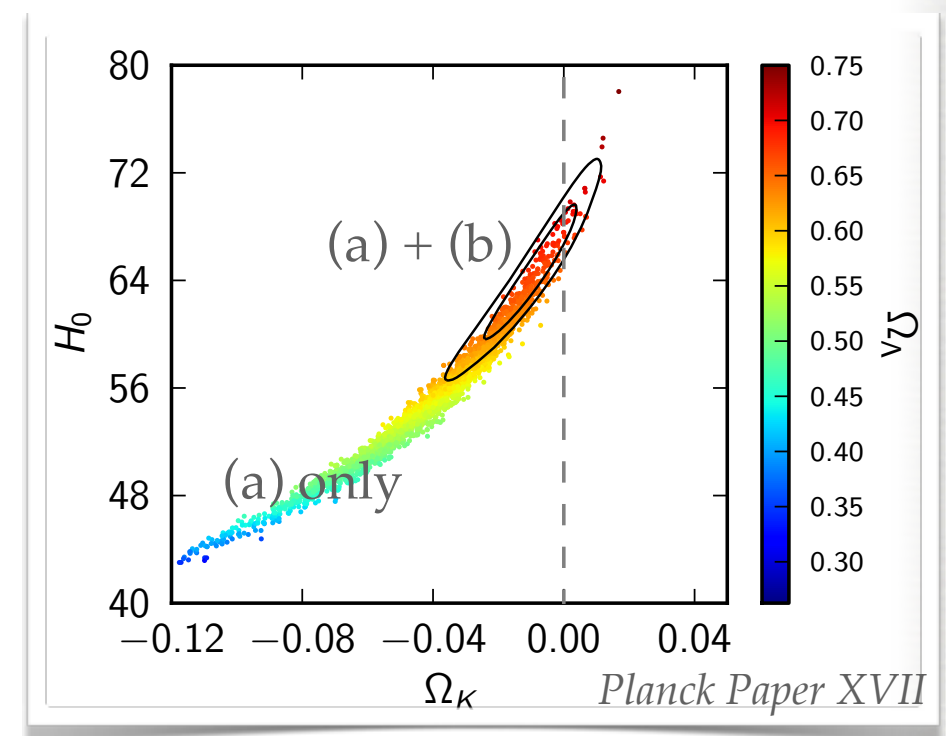
- Probe late time DM distribution to break degeneracies of primary CMB, or get bias
- Both (a) and (b) detected at many- $\sigma$  level (ACT, SPT, *Planck*; soon ACTPol, SPTpol)

## How do CMB experiments deal with lensing?

(a) Smoothed  $C^{\tilde{T}\tilde{T}}$  automatically included by using *lensed* power spectrum

(b) Reconstruction  $\hat{\phi}_{\text{rec}}$  can be added, e.g. for *Planck*:

- Reduction of errors on  $\Omega_K$  and  $\Omega_\Lambda$  by factor  $\sim 2$  (evidence for flatness and DE from CMB alone\*)
- Constraint on  $\tau$  without WMAP polarization
- Neutrino masses: curious preference for large  $m_\nu$
- Consistency with  $z \sim 1100$  CMB physics seen by *Planck*



\*First found by Blake Sherwin et al. 2011 (with ACT)

# CMB LENSING MOTIVATION

## Why do we care?

- Probe late time DM distribution to break degeneracies of primary CMB, or get bias
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(b) Reconstruction  $\hat{\phi}_{\text{rec}}$  can be added, e.g. for *Planck*:

- Reduction of errors on  $\Omega_m$  and  $\Omega_b$

(evidence) Requires *joint* likelihood for  $\hat{C}^{\tilde{T}\tilde{T}}$  and  $\hat{C}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}$

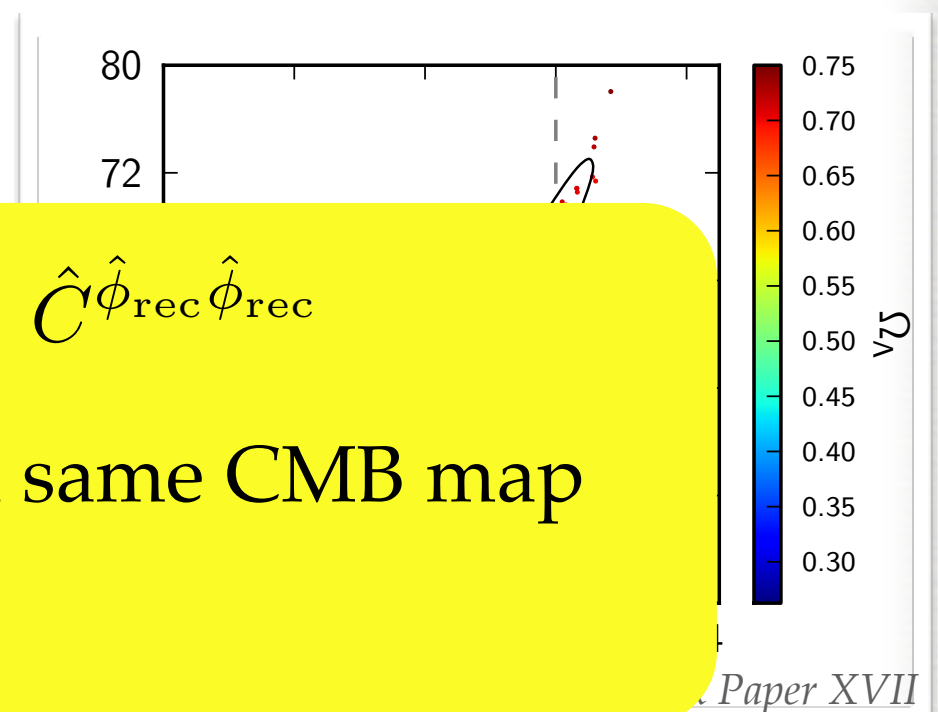
- Consistency

⇒ Non-trivial because derived from same CMB map

- Neutrino

- Consistency

⇒ Need  $\text{cov}(\hat{C}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}^{\tilde{T}\tilde{T}})$



\*First found by Blake Sherwin et al. 2011 (with ACT)



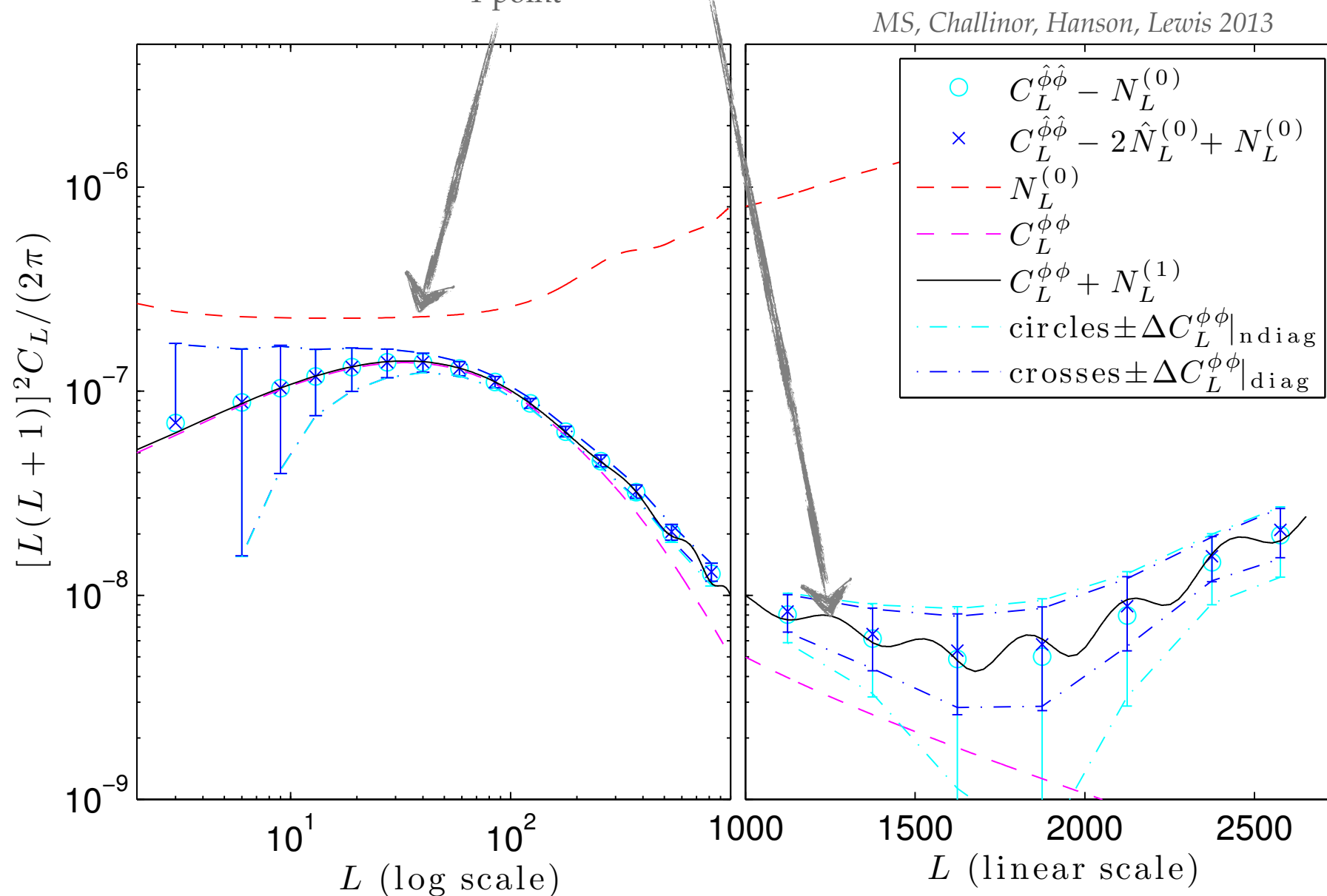
# CMB LENSING RECONSTRUCTION LIKELIHOOD INGREDIENTS

For likelihood based on reconstruction power spectrum  $\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \sim \tilde{T}^4$ , need to know:

- Expectation value  $\langle \hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \rangle = N_L^{(0)} + C_L^{\phi\phi} + N_L^{(1)}$   

disconn.  
4-point
connected 4-point

*Kesden et al. 0302536;  
Hanson et al. 1008.4403*



# CMB LENSING RECONSTRUCTION

## LIKELIHOOD INGREDIENTS

For likelihood based on **reconstruction power spectrum**  $\hat{C}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \sim \tilde{T}^4$ , need to know:

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disconn.  
4-point
connected 4-point

*Kesden et al. 0302536;  
Hanson et al. 1008.4403*

- **Auto-covariance**  $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}})$

⇒ Dominant contributions from disconnected 8-point of  $\tilde{T}$ ,  
 can be diagonalised with realisation-dependent  $N^{(0)}$  subtraction

*Hanson et al. 1008.4403;  
MS, Challinor, Hanson,  
Lewis 1308.0286*



# CMB LENSING RECONSTRUCTION LIKELIHOOD INGREDIENTS

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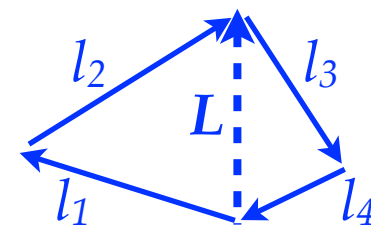
*Hanson et al. 1008.4403;  
MS, Challinor, Hanson,  
Lewis 1308.0286*

- **Cross-covariance**  $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$

⇒ **6-point:**

$$\text{cov}(\hat{C}_L^{\hat{\phi}\hat{\phi}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}}) \propto \sum_{l_1, l_2, l_3, l_4, M, M'} (-1)^{M+M'} \begin{pmatrix} l_1 & l_2 & L \\ m_1 & m_2 & -M \end{pmatrix} \begin{pmatrix} l_3 & l_4 & L \\ m_3 & m_4 & M \end{pmatrix} \tilde{g}_{l_1 l_2}(L) \tilde{g}_{l_3 l_4}(L) \times \left[ \langle \tilde{T}_{l_1} \tilde{T}_{l_2} \tilde{T}_{l_3} \tilde{T}_{l_4} \tilde{T}_{L'M'} \tilde{T}_{L', -M'} \rangle - \langle \tilde{T}_{l_1} \tilde{T}_{l_2} \tilde{T}_{l_3} \tilde{T}_{l_4} \rangle \langle \tilde{T}_{L'M'} \tilde{T}_{L', -M'} \rangle \right].$$

*MS, Challinor, Hanson,  
Lewis 1308.0286*



(i) connected 6-point      (ii) disconnected      (iii) connected 4-point (neglect here)

(i)

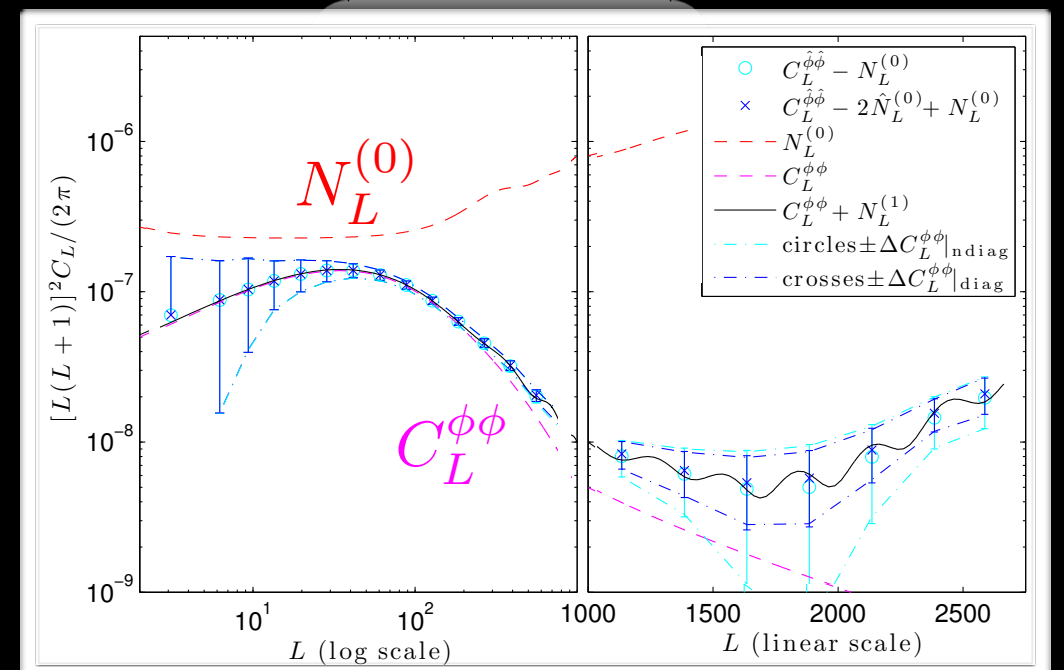
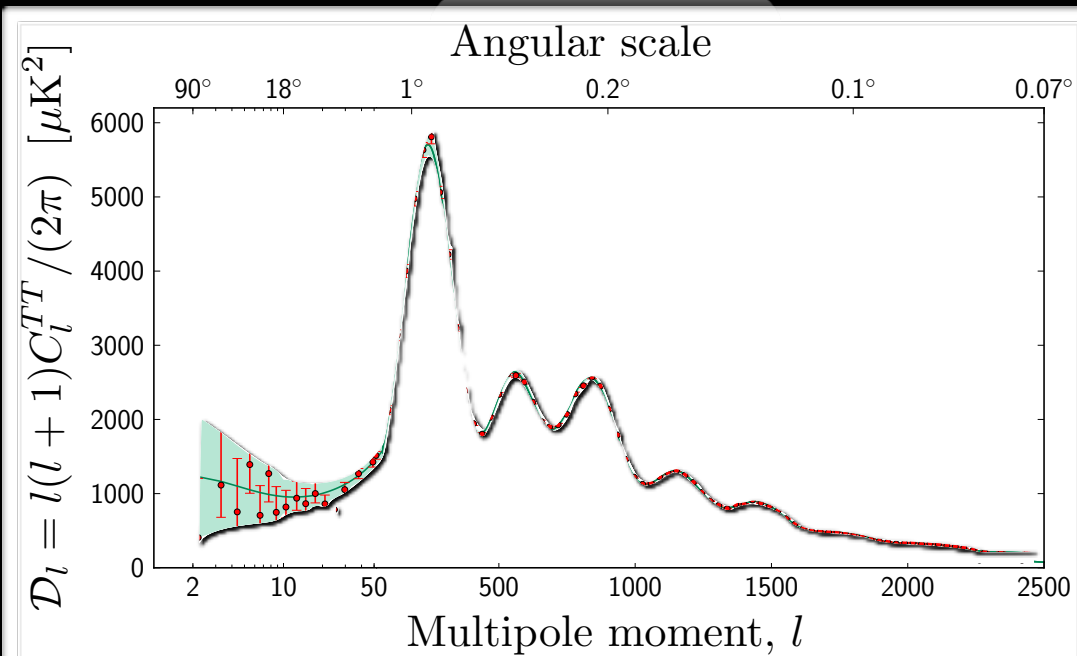
Unlensed CMB

Lenses

Lensed CMB

$$\hat{C}_L^{\tilde{T}\tilde{T}} \propto \tilde{T}^2$$

$$\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \propto \tilde{T}^4$$





(i)

Unlensed CMB

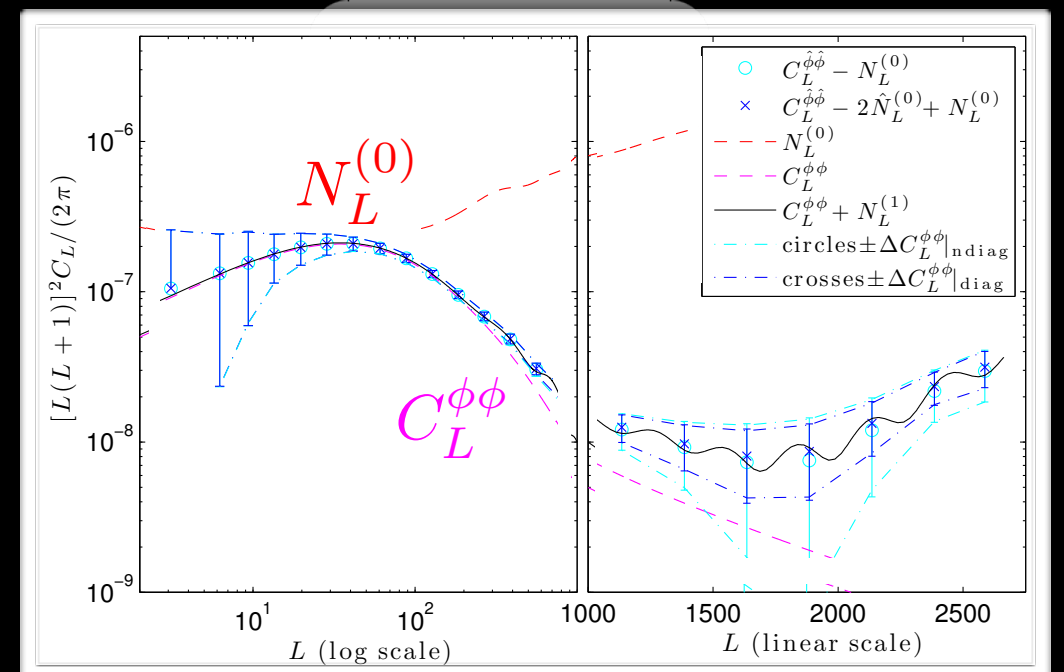
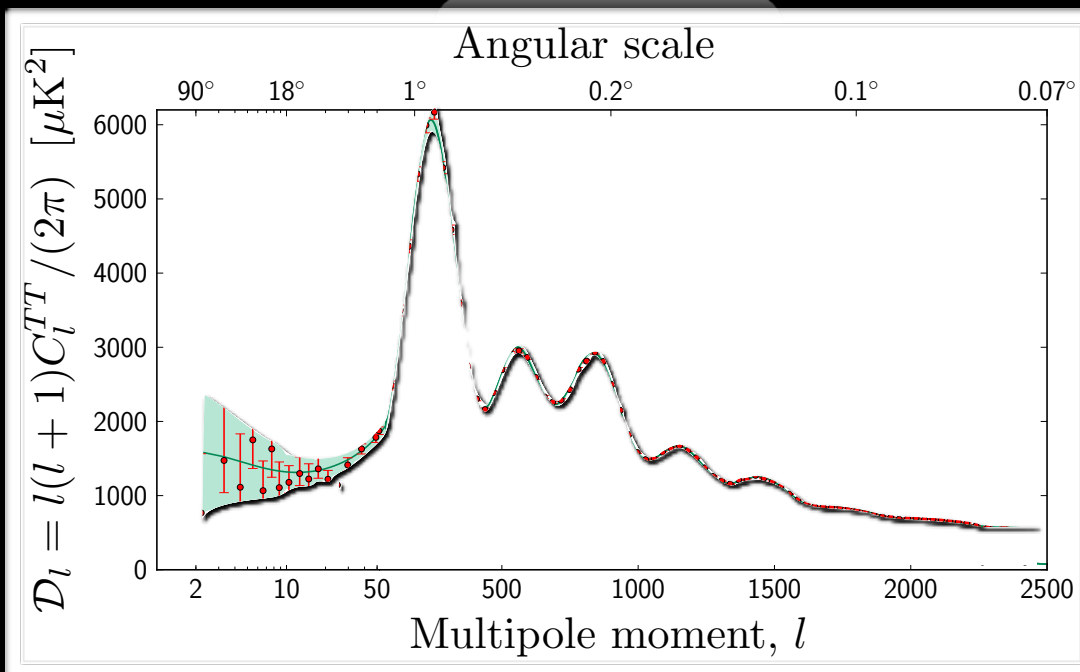
Lenses

Lensed CMB

Cosmic  
variance

$$\hat{C}_L^{\tilde{T}\tilde{T}} \propto \tilde{T}^2$$

$$\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \propto \tilde{T}^4$$



# LIKELIHOOD INGREDIENTS

## TEMPERATURE-LENSING POWER-COVARIANCE

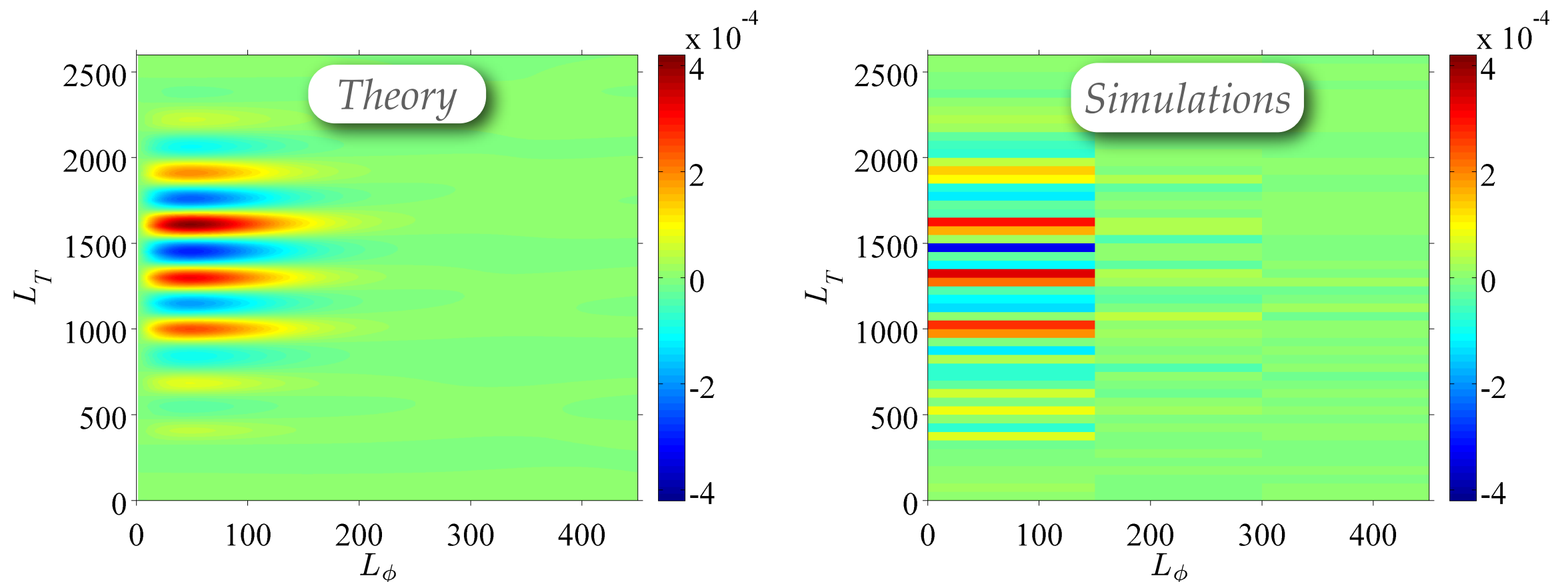
MS, Challinor, Hanson, Lewis 1308.0286

(i) If lensing field fluctuates high, CMB power is smoother and reconstruction is high

⇒ Derives from connected CMB 6-point at  $\mathcal{O}(\phi^4)$

$$\text{cov}(\hat{C}_{L_\phi}^{\phi_{\text{rec}}\phi_{\text{rec}}}, \hat{C}_{L_T, \text{expt}}^{\tilde{T}\tilde{T}})_{\text{conn.6pt.}}^{\mathcal{O}(\phi^4)} = \frac{2}{2L_\phi + 1} \left(C_{L_\phi}^{\phi\phi}\right)^2 \frac{\partial C_{L_T}^{\tilde{T}\tilde{T}}}{\partial C_{L_\phi}^{\phi\phi}}$$

Correlation of *unbinned* power spectra is up to  $\sim 0.04\%$  (at low  $L_\phi$ ):



Minima at acoustic peaks of temperature power which are decreased by larger lensing power; maxima at acoustic troughs



(ii)

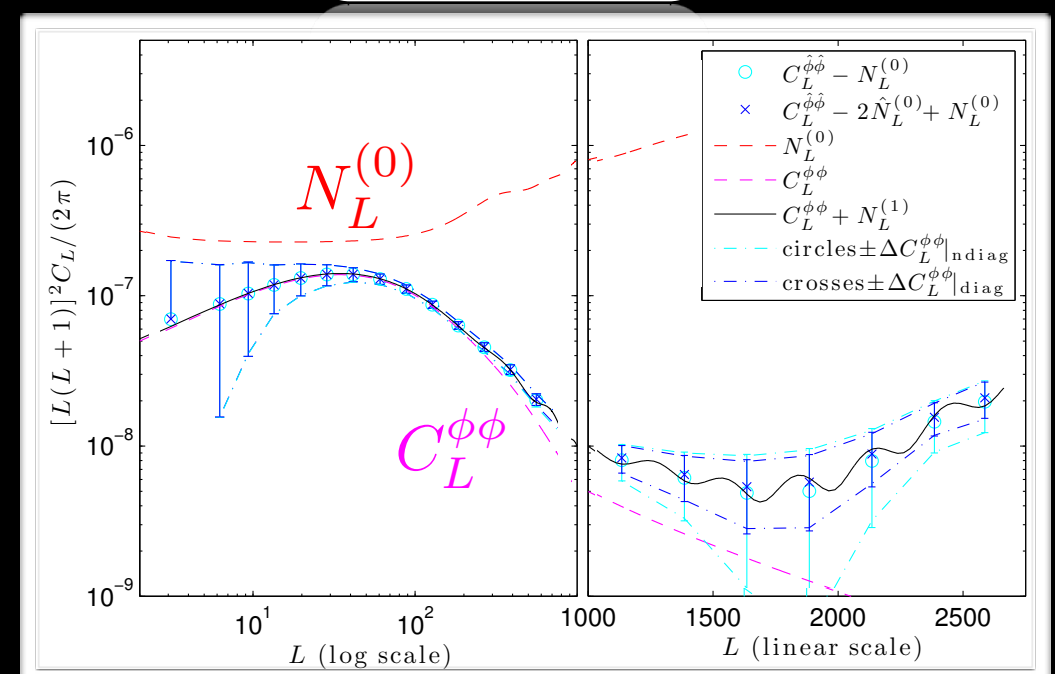
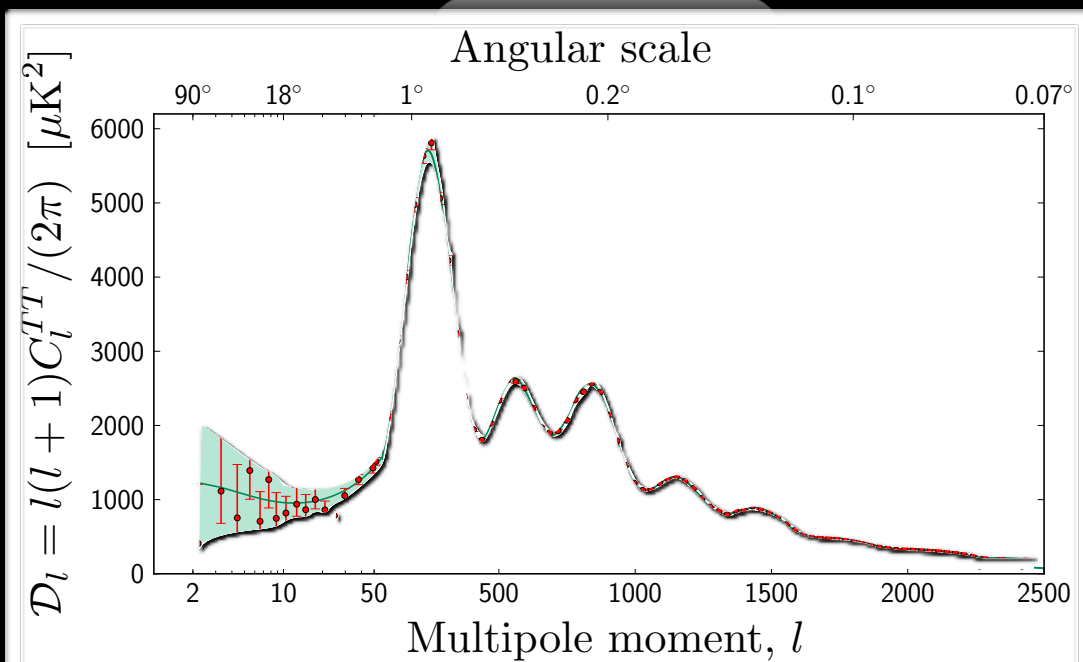
*Unlensed CMB*

*Lenses*

*Lensed CMB*

$$\hat{C}_L^{\tilde{T}\tilde{T}} \propto \tilde{T}^2$$

$$\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \propto \tilde{T}^4$$



(ii)

Unlensed CMB

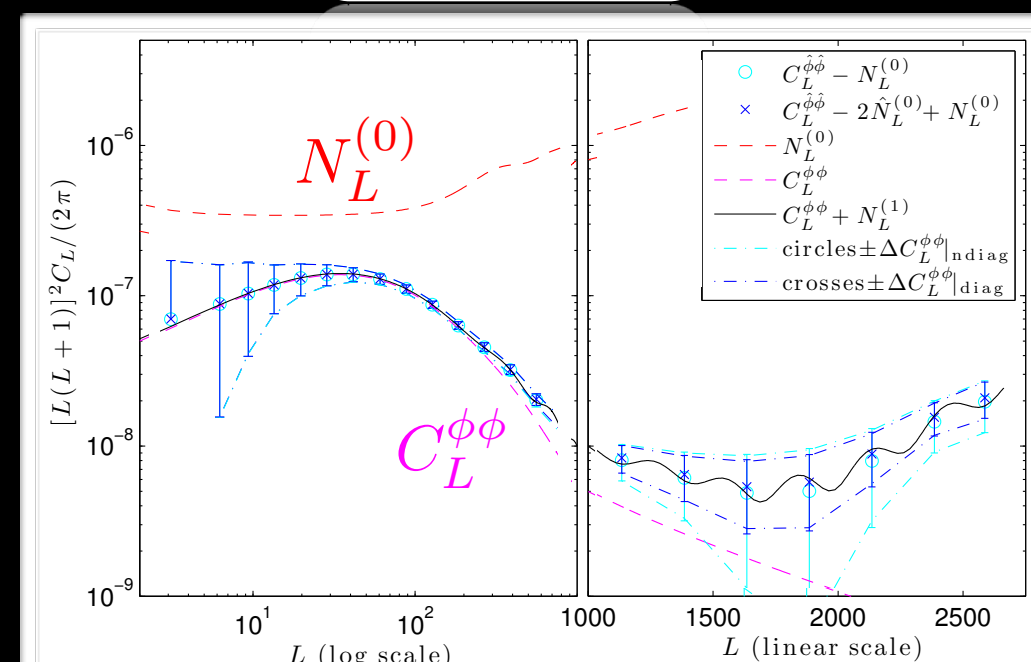
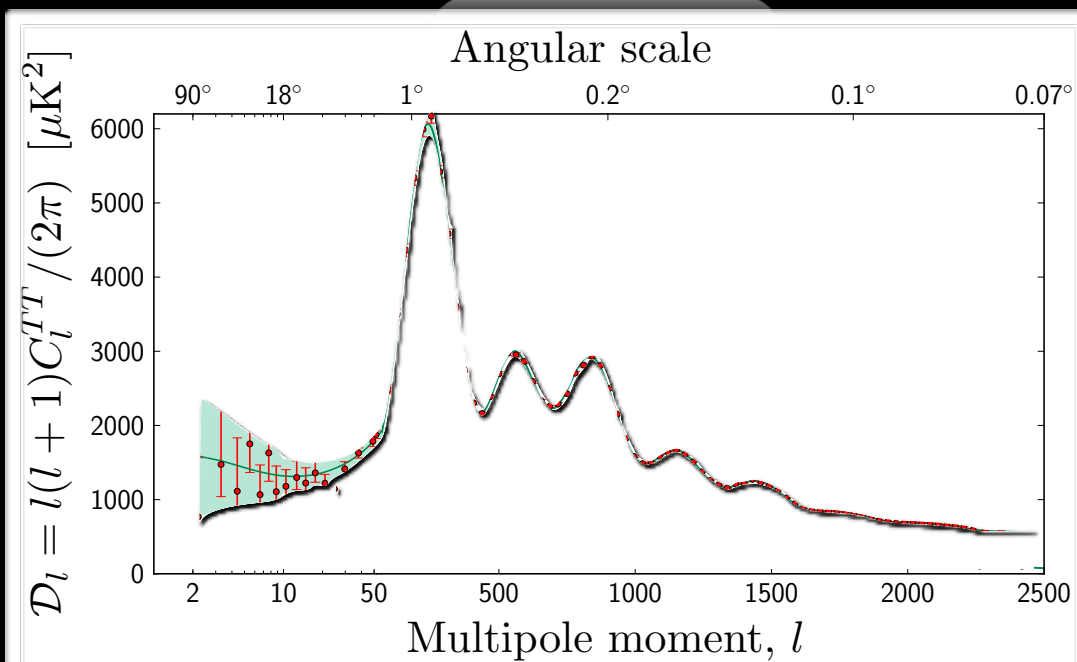
Cosmic  
variance

Lenses

Lensed CMB

$$\hat{C}_L^{\tilde{T}\tilde{T}} \propto \tilde{T}^2$$

$$\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}} \propto \tilde{T}^4$$





# LIKELIHOOD INGREDIENTS

## TEMPERATURE-LENSING POWER-COVARIANCE

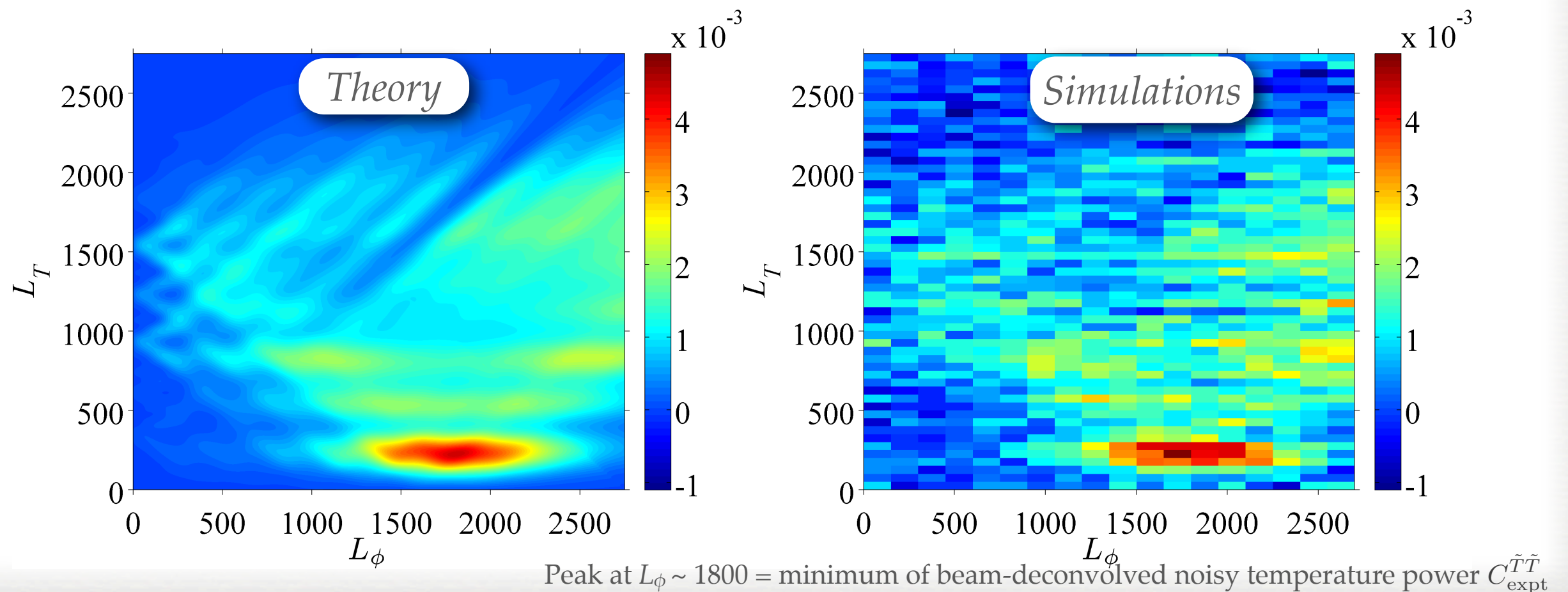
MS, Challinor, Hanson, Lewis 1308.0286

(ii) If unlensed CMB fluctuates high, CMB power and Gaussian rec. noise  $N^{(0)}$  are high

⇒ Derives from disconnected CMB 6-point

$$\text{cov}(\hat{C}_{L_\phi}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L_T, \text{expt}}^{\tilde{T}\tilde{T}})_{\text{disc.}}^{\mathcal{O}(\phi^0)} = \frac{\partial(2\hat{N}_{L_\phi}^{(0)})}{\partial \hat{C}_{L_T, \text{expt}}^{\tilde{T}\tilde{T}}} \frac{2}{2L_T + 1} \left( C_{L_T, \text{expt}}^{\tilde{T}\tilde{T}} \right)^2$$

Correlation of *unbinned* power spectra is up to ~0.5% (at very high  $L_\phi$ ):



# LIKELIHOOD INGREDIENTS

## TEMPERATURE-LENSING POWER-COVARIANCE

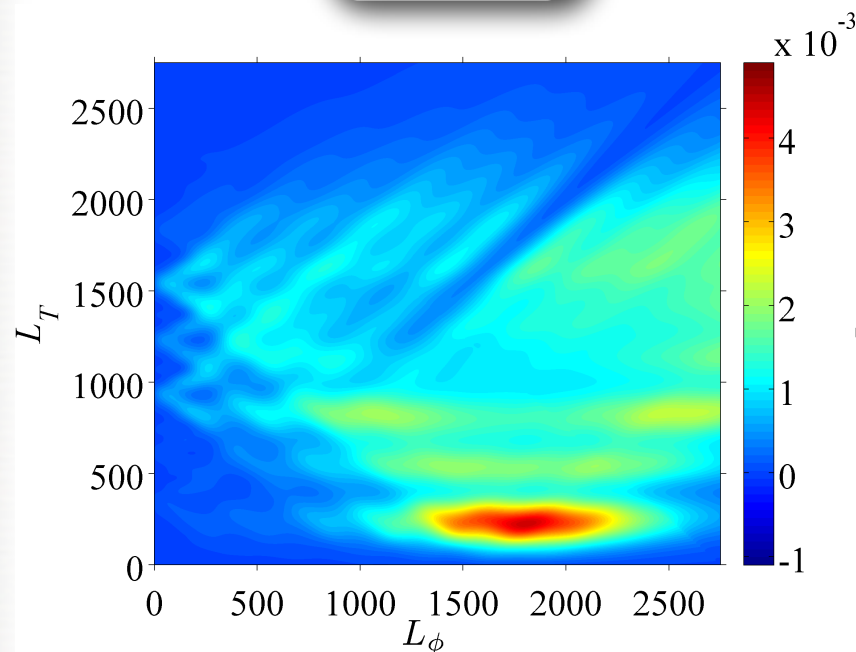
MS, Challinor, Hanson, Lewis 1308.0286

- Decorrelating power spectra

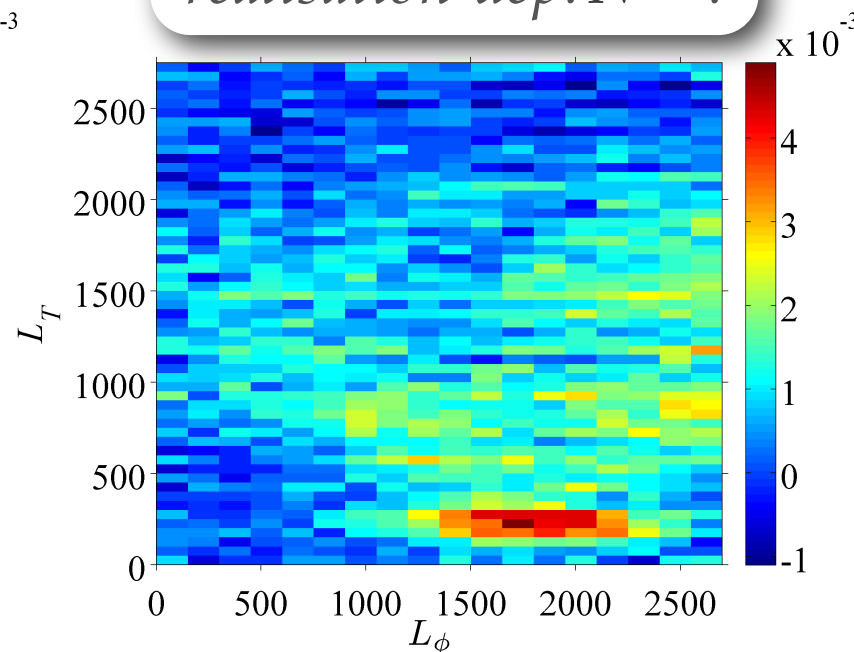
⇒ Can remove noise contribution (ii) with realisation-dependent bias correction

$$\hat{C}_L^{\hat{\phi}\hat{\phi}} - 2\hat{N}_L^{(0)} = \hat{C}_L^{\hat{\phi}\hat{\phi}} - \sum_{L'} \frac{\partial(2\hat{N}_L^{(0)})}{\partial \hat{C}_{L',\text{expt}}^{\tilde{T}\tilde{T}}} \hat{C}_{L',\text{expt}}^{\tilde{T}\tilde{T}}$$

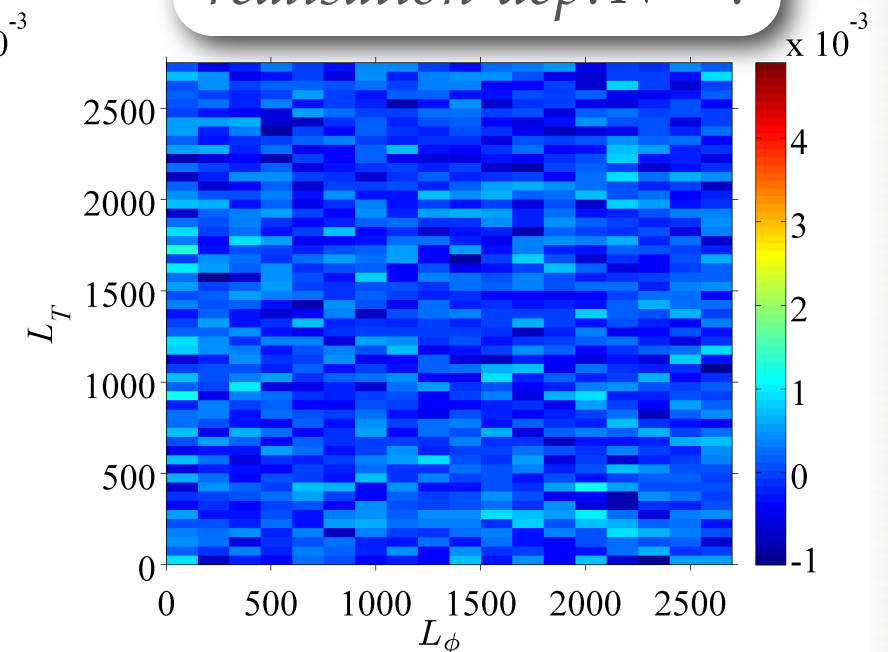
Theory



Simulations *w/o*  
realisation-dep.  $\hat{N}^{(0)}$ .



Simulations *with*  
realisation-dep.  $\hat{N}^{(0)}$ .



⇒ This also mitigates the off-diagonal reconstruction power *auto*-covariance (for the same reason); can be understood from optimal trispectrum estimation



# OPTIMAL TRISPECTRUM ESTIMATION

Obtain realisation-dependent  $\hat{N}^{(0)}$  bias mitigation also from optimal trispectrum estimator using Edgeworth-expansion of lensed temperature around Gaussian:

$$\begin{array}{c}
 \text{reconstruction power} \quad \text{realisation-dep.} \quad \text{realisation-indep.} \\
 \hat{C}\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}} \quad - \quad 2\hat{N}^{(0)} \quad + \quad N^{(0)} \\
 \uparrow \quad \quad \quad \uparrow \quad \quad \quad \uparrow \\
 P(T) = \left\{ 1 + \frac{1}{24} \underbrace{\langle T_i T_j T_k T_l \rangle_c}_{\text{lensing trispectrum}} \left[ \bar{T}_i \bar{T}_j \bar{T}_k \bar{T}_l - (C_{ij}^{-1} \bar{T}_k \bar{T}_l + 5 \text{ perms}) + (C_{ij}^{-1} C_{kl}^{-1} + 2 \text{ perms}) \right] \right\} \\
 \times \frac{e^{-T_i C_{ij}^{-1} T_j / 2}}{\sqrt{\det(2\pi C)}}
 \end{array}$$

$T_i$  = lensed temperature

$C_{ij} = \langle T_i T_j \rangle$

$\bar{T}_i = C_{ij}^{-1} T_j$

# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$ LENSING AMPLITUDE

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Impact of temperature-lensing power covariance on **lensing amplitude  $A$** :

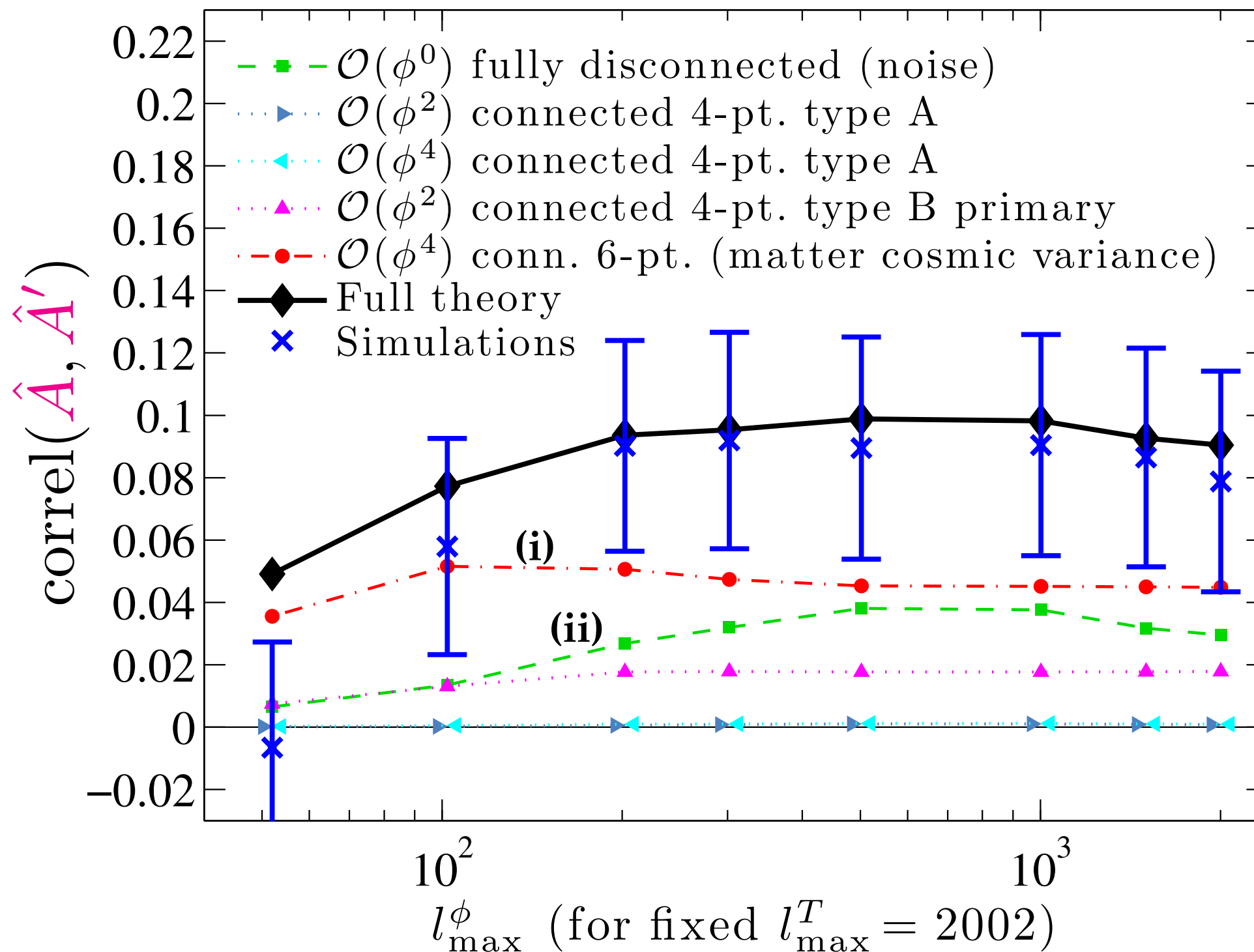
- Rescale lensing power spectrum  $C_L^{\phi\phi} \rightarrow A C_L^{\phi\phi}$
  - Estimate from reconstruction power spectrum,  $\hat{A}[\hat{C}^{\phi\phi}]$
  - and from smoothing of temperature power spectrum,  $\hat{A}'[\hat{C}_{\text{expt}}^{\tilde{T}\tilde{T}}]$
- ⇒  $\text{cov}(\hat{A}, \hat{A}')$  is linearly related to  $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$



# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$

## LENSING AMPLITUDE

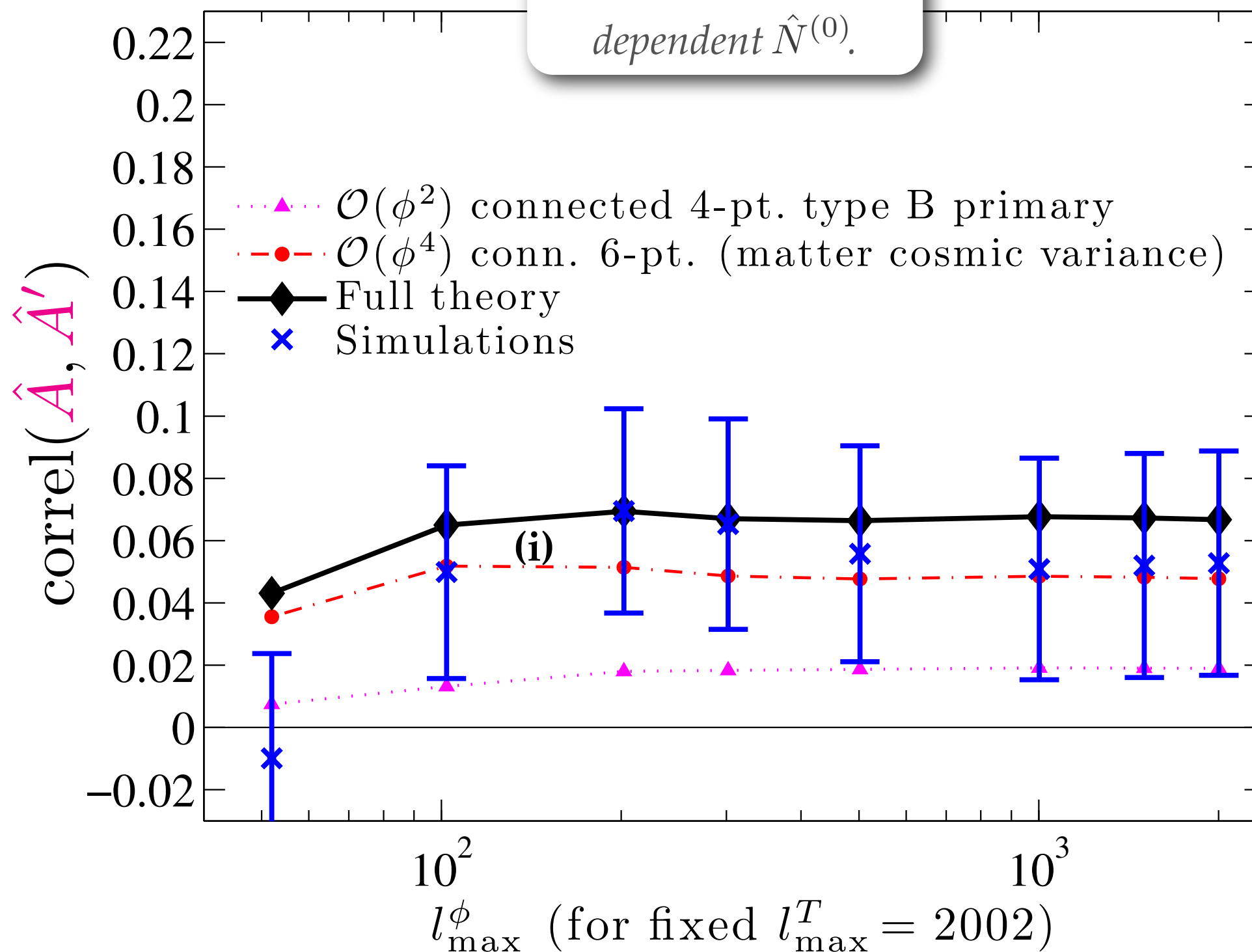
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# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$ LENSING AMPLITUDE

*With realisation-  
dependent  $\hat{N}^{(0)}$ .*

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# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$ LENSING AMPLITUDE

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⇒ Neglecting  $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$  underestimates error of joint amplitude estimate by

$$\Delta\sigma_{A_{\text{joint}}} \sim \text{correl}(\hat{A}, \hat{A}')/2 \sim 3.5\%$$

(with realisation-dependent  $\hat{N}^{(0)}$ ,  
otherwise  $\sim 5\%$ )

⇒ *Temperature-lensing power-covariance is negligible for combined amplitude estimate (and for cosmological parameters)*

# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$ LENSING AMPLITUDE

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## Physical reasons for smallness of amplitude correlation

### (i) Lens cosmic variance

- $\text{cov}(A, A')$  is limited by the small number of  $C^{\phi\phi}$  modes affecting acoustic region of  $C^{\tilde{T}\tilde{T}}$  (including more lensing modes in  $A[C^{\phi\phi}]$  reduces  $\text{cov}(A, A')$  because there are increasingly more lensing modes in  $A[C^{\phi\phi}]$  whose fluctuations don't enter  $A'[C^{\tilde{T}\tilde{T}}]$ ).
- $\text{correl}(A, A')$  due to cosmic variance of these modes is diluted by CMB cosmic variance and instrumental noise (because  $A$  and  $A'$  are not limited by cosmic variance of the lenses)



# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$ LENSING AMPLITUDE

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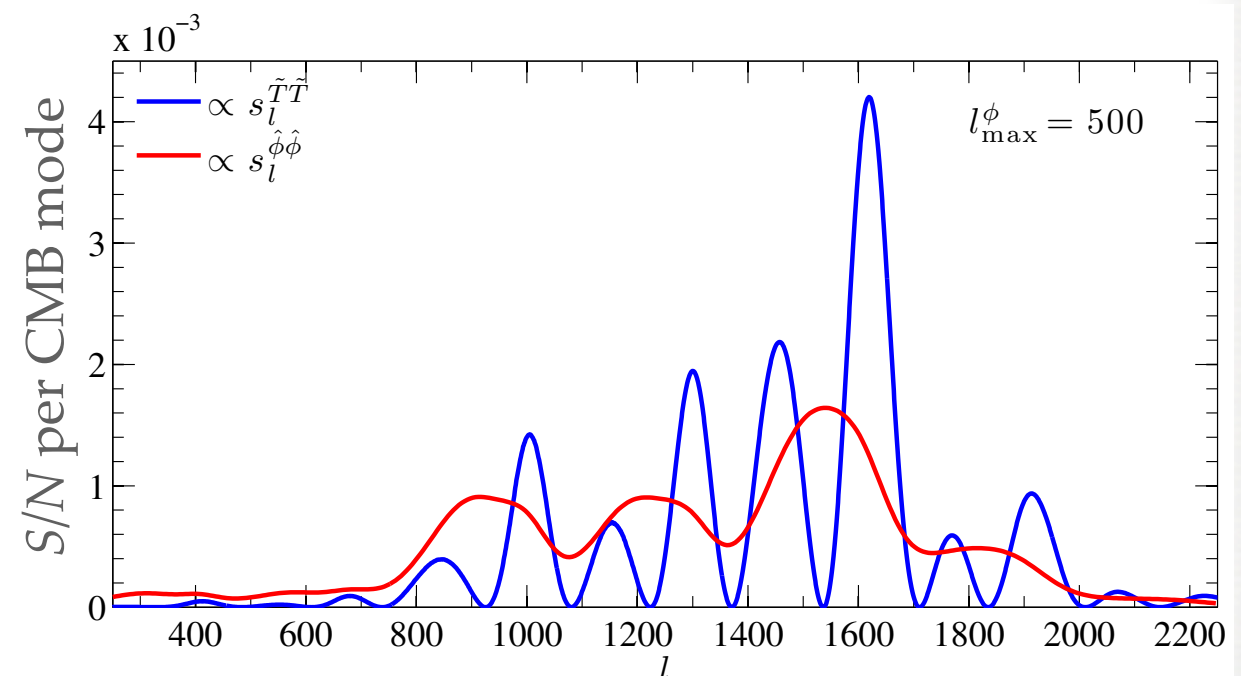
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- $\text{correl}(A, A')$  due to cosmic variance of these modes is diluted by CMB cosmic variance and instrumental noise (because  $A$  and  $A'$  are not limited by cosmic variance of the lenses)

### (ii) CMB cosmic variance

Roughly disjoint (independently fluctuating) scales in the CMB contribute to **amplitude determination from peak-smearing** and to **lens reconstruction**



# IMPACT OF $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$ PHYSICAL PARAMETERS

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Impact of  $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$  on **phys. params.**  $\mathbf{p} = (\Omega_b h^2, \Omega_c h^2, h, \tau, A_s, n_s, \Omega_\nu h^2, \Omega_K)$

- Joint data vector:  $\underline{\hat{C}} = (\hat{C}_{\text{expt}}^{\tilde{T}\tilde{T}}, \hat{C}^{\hat{\phi}\hat{\phi}} - 2\hat{N}^{(0)} + N^{(0)})$

- Joint covariance

$$\text{COV}_{LL', \text{joint}} \equiv \text{cov}(\underline{\hat{C}}_L, \underline{\hat{C}}_{L'}) = \begin{pmatrix} \delta_{LL'} \text{var}_G(C_{L, \text{expt}}^{\tilde{T}\tilde{T}}) & \text{cov}(\hat{C}_L^{\tilde{T}\tilde{T}}, \hat{C}_{L'}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}) \\ \text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}}) & \delta_{LL'} \text{var}_G(\langle \hat{C}_L^{\hat{\phi}\hat{\phi}} \rangle) \end{pmatrix}$$

- Fisher matrix:  $F_{ij} = \sum_{LL'} \frac{\partial \underline{C}_L}{\partial p_i} (\text{cov}_{\text{joint}}^{-1})_{LL'} \frac{\partial \underline{C}_{L'}}{\partial p_j}$

⇒ Fisher errors increase by **at most 0.7%** if  $\text{cov}(\hat{C}_L^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}, \hat{C}_{L'}^{\tilde{T}\tilde{T}})$  is included

⇒ *Temperature-lensing power-covariance negligible for physical parameter errors*



# CMB LENSING RECONSTRUCTION LIKELIHOOD FORM

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So far assumed likelihood based on reconstruction *power*  $\hat{C}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}$  instead of  $\hat{\phi}_{\text{rec}}$  *map*

- ⇒ Well established for temperature, but unclear for (non-Gaussian) reconstruction
- ⇒ Compare two lensing-likelihood models:

1. Gaussian in  $\hat{\phi}_{\text{rec}}$ :

$$-2 \ln \mathcal{L}_1(\hat{\phi}|A) \propto \sum_l (2l+1) \left( \frac{\hat{C}_l^{\hat{\phi}\hat{\phi}}}{AC_l^{\phi\phi} + N_l} + \ln |AC_l^{\phi\phi} + N_l| \right)$$

2. Gaussian in  $\hat{C}^{\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}}$  (with parameter-independent covariance):

$$-2 \ln \mathcal{L}_2(\hat{C}^{\hat{\phi}\hat{\phi}}|A) \propto \sum_{l,l'} \left[ \hat{C}_l^{\hat{\phi}\hat{\phi}} - (AC_l^{\phi\phi} + N_l) \right] (\text{cov}_{\phi\phi}^{-1})_{ll'} \left[ \hat{C}_{l'}^{\hat{\phi}\hat{\phi}} - (AC_{l'}^{\phi\phi} + N_{l'}) \right]$$

- ⇒ Estimate lensing amplitude (and tilt) from both likelihoods, compare scatter of best-fit parameter vs. likelihood width

# CMB LENSING RECONSTRUCTION LIKELIHOOD FORM

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- ⇒ Estimate lensing amplitude (and tilt) from both likelihoods, compare scatter of best-fit parameter vs. likelihood width
- ⇒ 2. performs better than 1. (see paper)

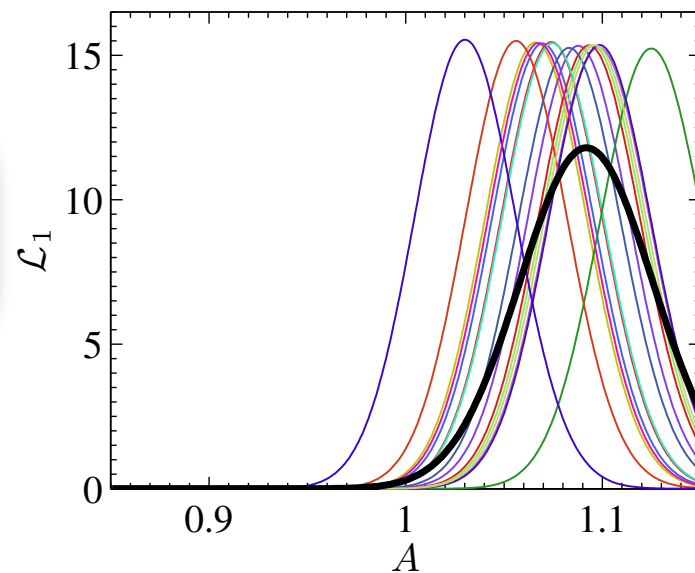


# CMB LENSING RECONSTRUCTION LIKELIHOOD TESTS

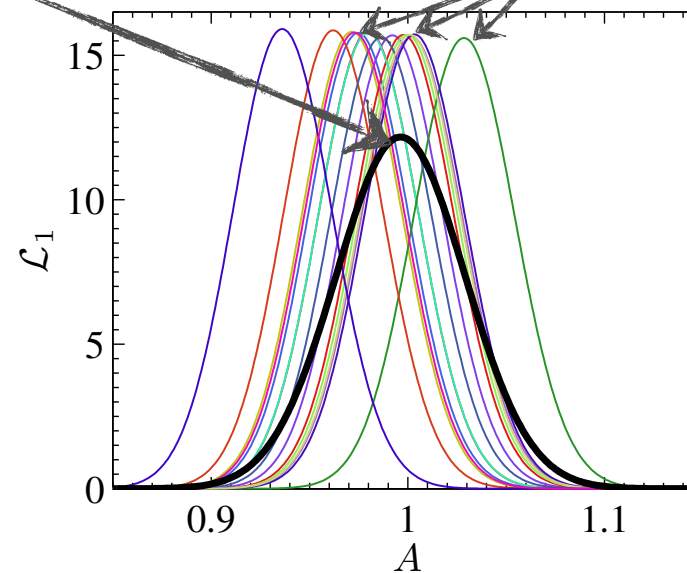
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Scatter of best-fit lensing amplitude  $A$  vs. likelihood width in single realisations

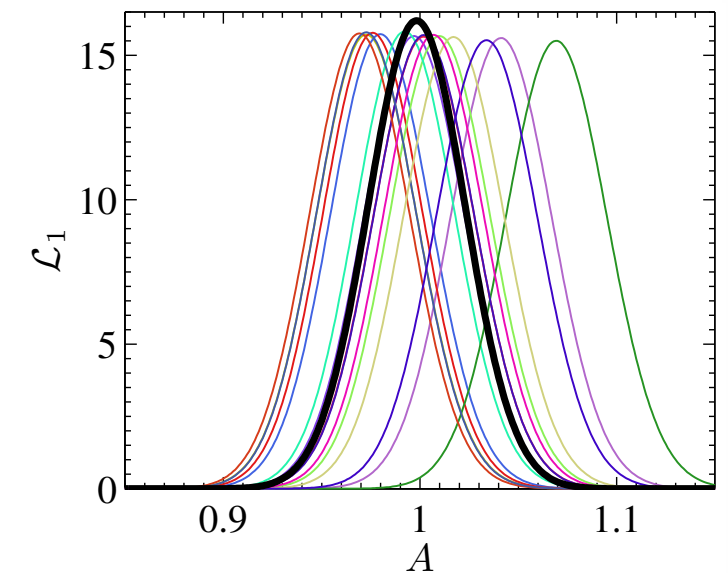
Gaussian  
in  $\hat{\phi}_{\text{rec}}$



(a)  $\mathcal{L}_1$  without  $N^{(1)}$ : biased



(b)  $\mathcal{L}_1$  with  $N^{(1)}$ : unbiased but underestimates variance



(c)  $\mathcal{L}_1$  for Gaussian mock  $\hat{\phi}_G$  with power  $C^{\phi\phi} + N^{(0)} + N^{(1)}$ : good

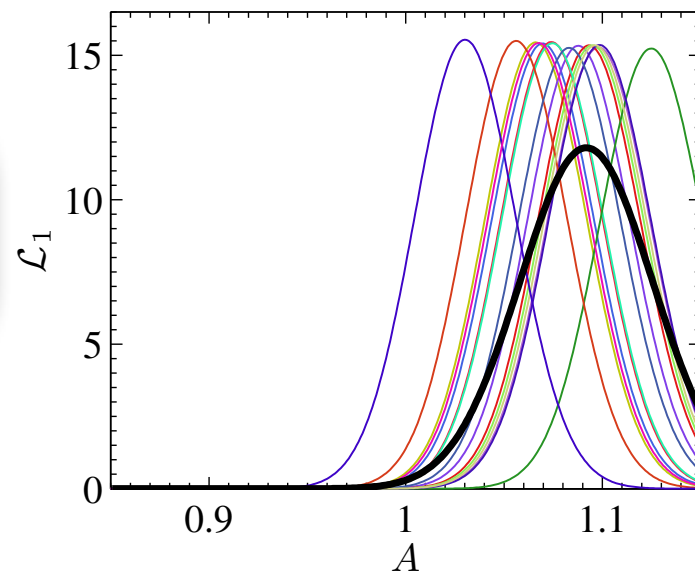
# CMB LENSING RECONSTRUCTION

## LIKELIHOOD TESTS

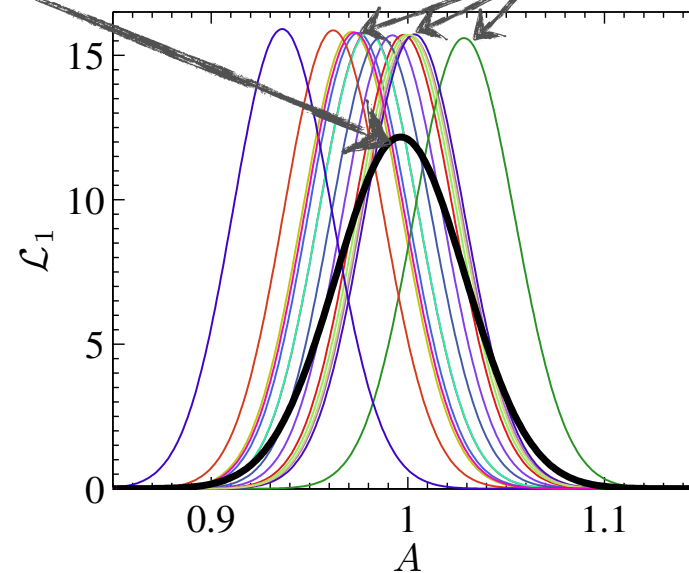
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Scatter of best-fit lensing amplitude  $A$  vs. likelihood width in single realisations

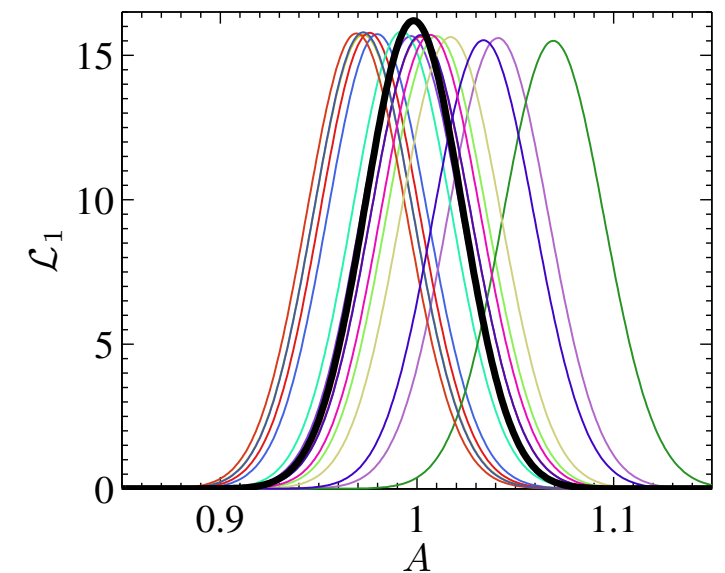
Gaussian  
in  $\hat{\phi}_{\text{rec}}$



(a)  $\mathcal{L}_1$  without  $N^{(1)}$ : biased

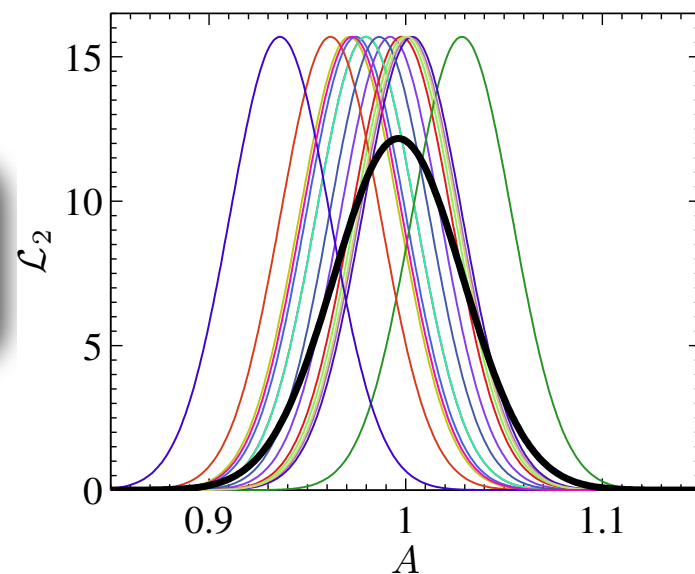


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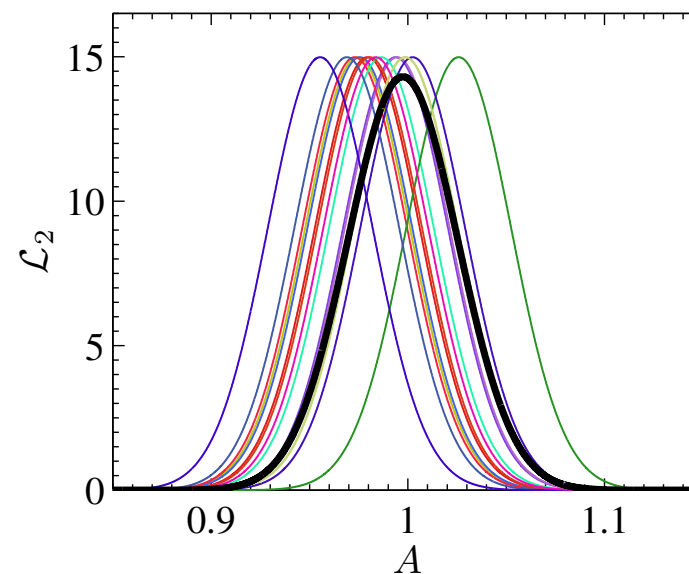


(c)  $\mathcal{L}_1$  for Gaussian mock  $\hat{\phi}_G$  with power  $C^{\phi\phi} + N^{(0)} + N^{(1)}$ : good

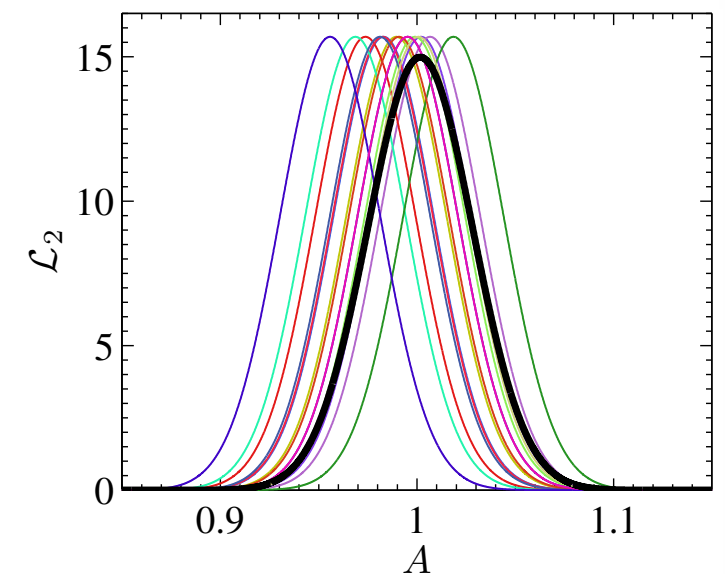
Gaussian  
in  $\hat{C}^{\phi\phi} \hat{\phi}_{\text{rec}} \hat{\phi}_{\text{rec}}$



(d)  $\mathcal{L}_2$  with diagonal covariance: underestimates variance



(e)  $\mathcal{L}_2$  with non-diagonal, non-Gaussian covariance: good



(f)  $\mathcal{L}_2$  with empirical  $\hat{N}^{(0)}$  subtraction and diagonal covariance: good

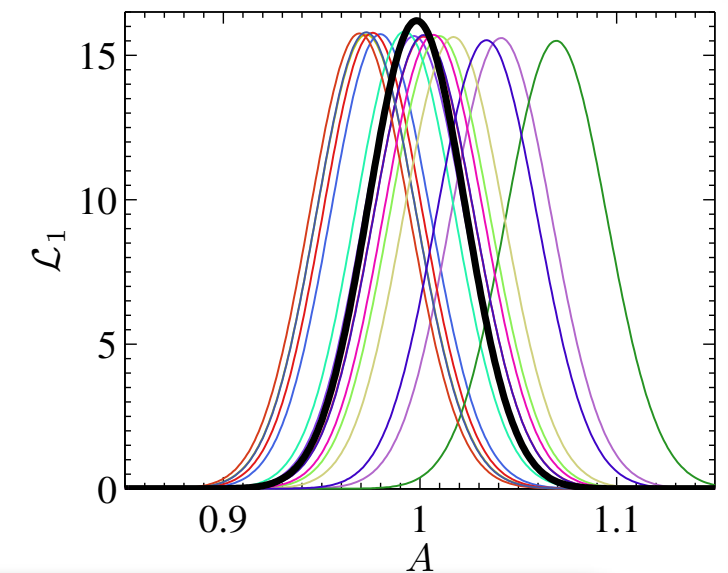
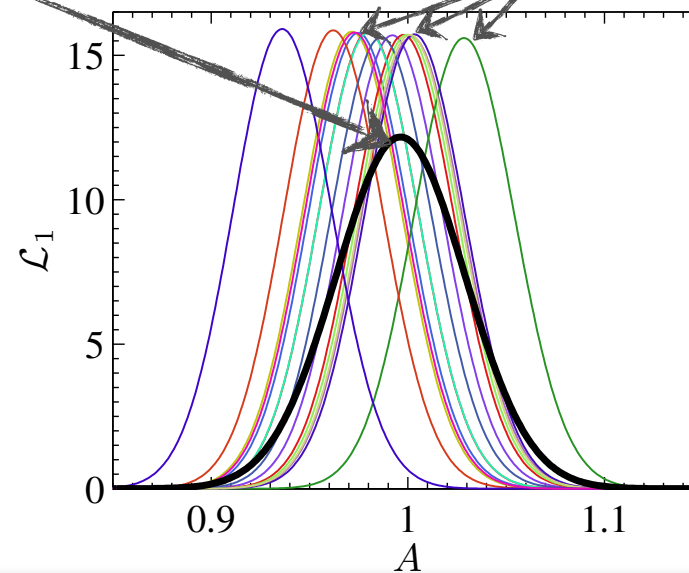
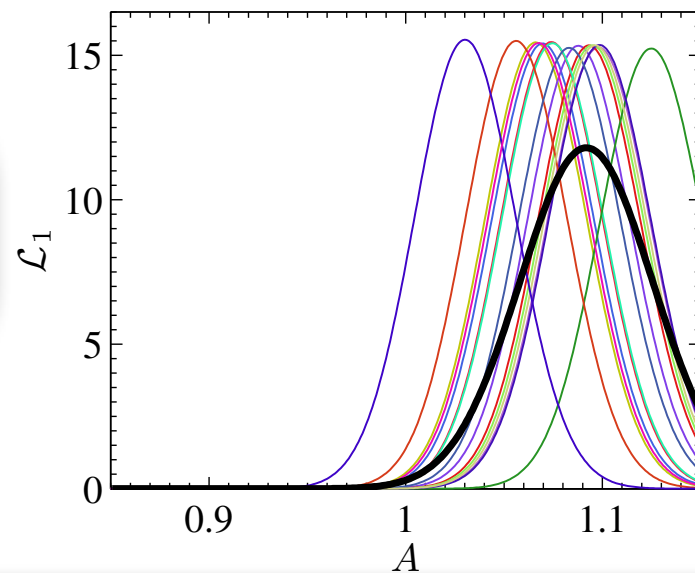


# CMB LENSING RECONSTRUCTION LIKELIHOOD TESTS

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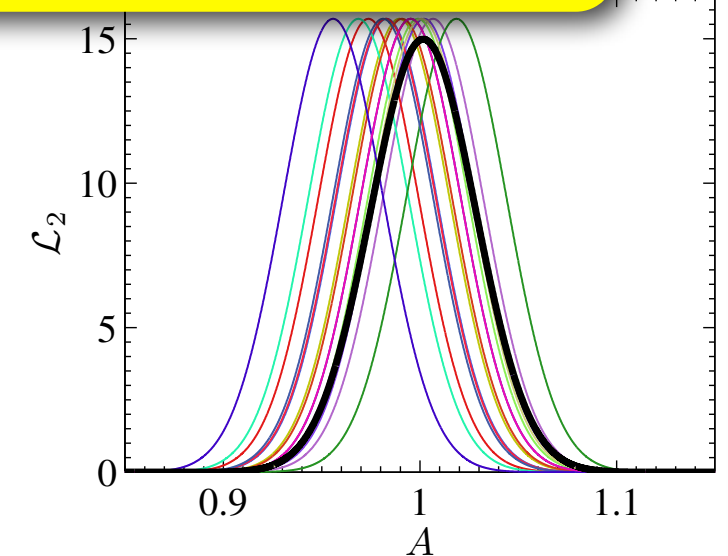
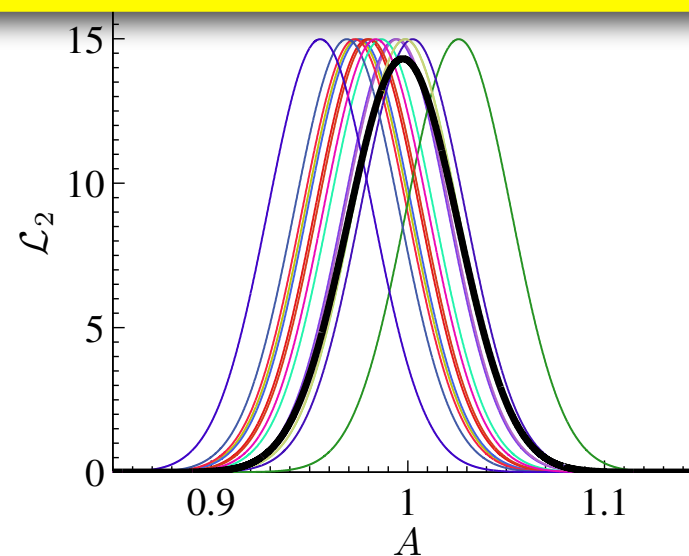
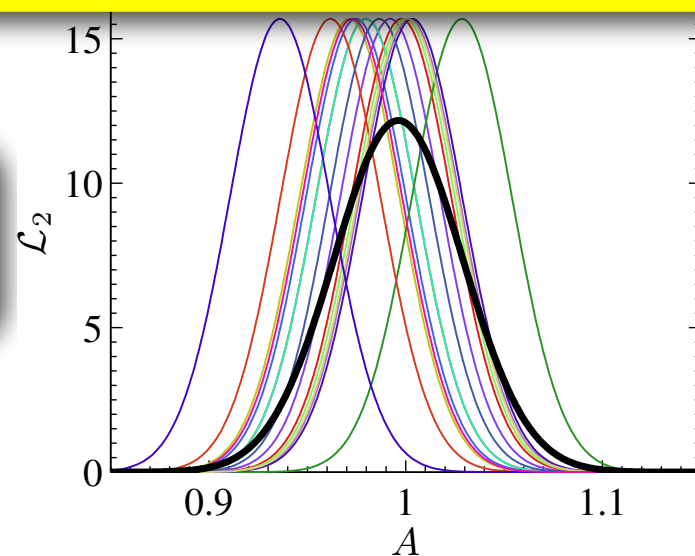
Scatter of best-fit lensing amplitude  $A$  vs. likelihood width in single realisations

Gaussian  
in  $\hat{\phi}_{\text{rec}}$



→ Including non-Gaussianity of reconstruction is important to get correct error bar

Gaussian  
in  $\hat{C}\hat{\phi}_{\text{rec}}\hat{\phi}_{\text{rec}}$



(d)  $\mathcal{L}_2$  with diagonal covariance: underestimates variance

(e)  $\mathcal{L}_2$  with non-diagonal, non-Gaussian covariance: good

(f)  $\mathcal{L}_2$  with empirical  $\hat{N}^{(0)}$  subtraction and diagonal covariance: good

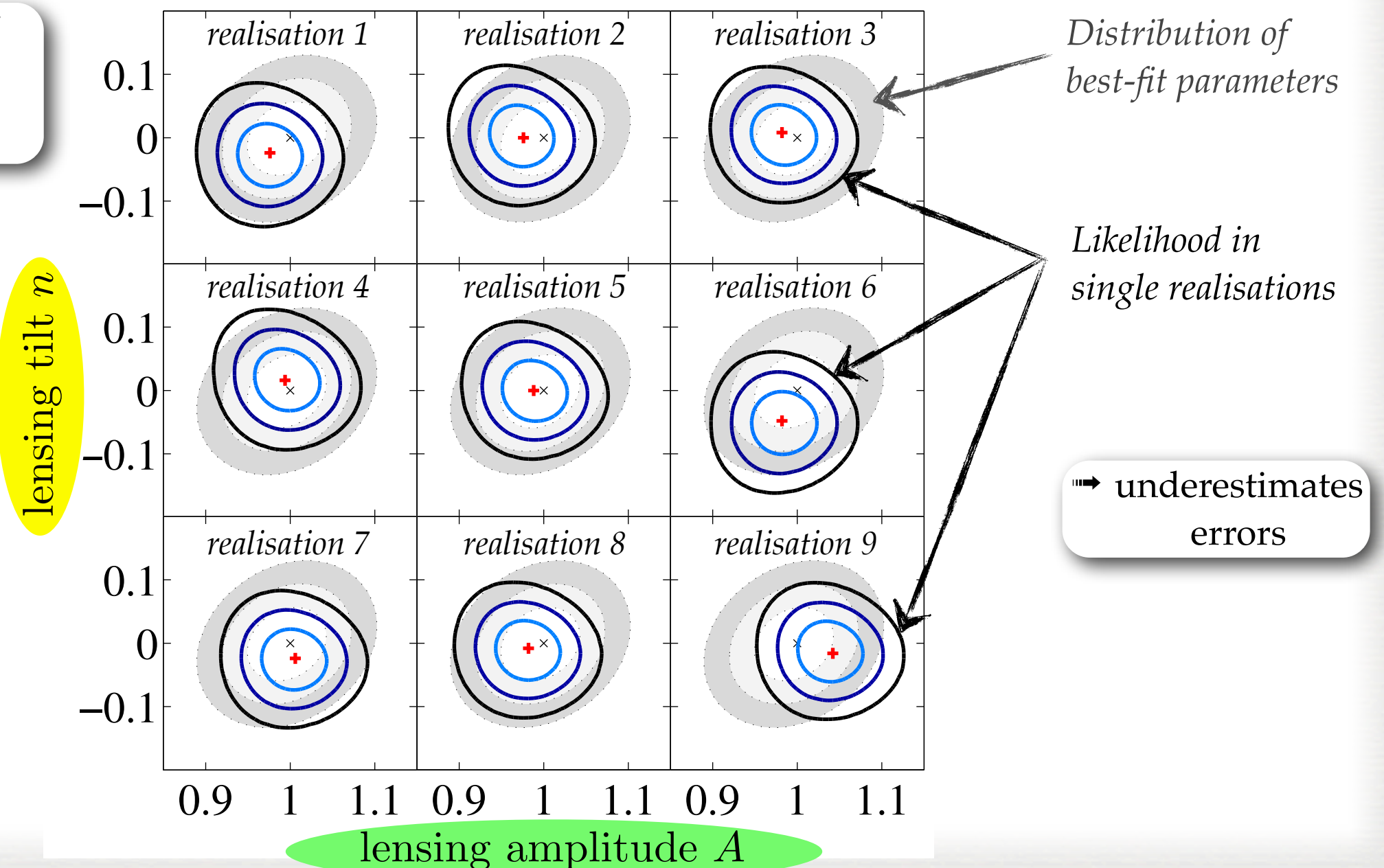
# CMB LENSING RECONSTRUCTION LIKELIHOOD TESTS

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For  $\mathcal{L}_2$ , we do not test the likelihood but rather the reconstruction power covariance (because  $\hat{A} \propto \hat{C}^{\phi\phi}$ )

→ Additionally vary **lensing tilt  $n$**  to test  $\mathcal{L}_2$ :  $C_l^{\phi\phi} \rightarrow A \left( \frac{l}{l_*} \right)^n C_l^{\phi\phi}$ ,  $l_* = 124$

$\mathcal{L}_2$  with *diagonal*  
 $\text{cov}(\hat{C}_L^{\phi\phi}, \hat{C}_{L'}^{\phi\phi})$





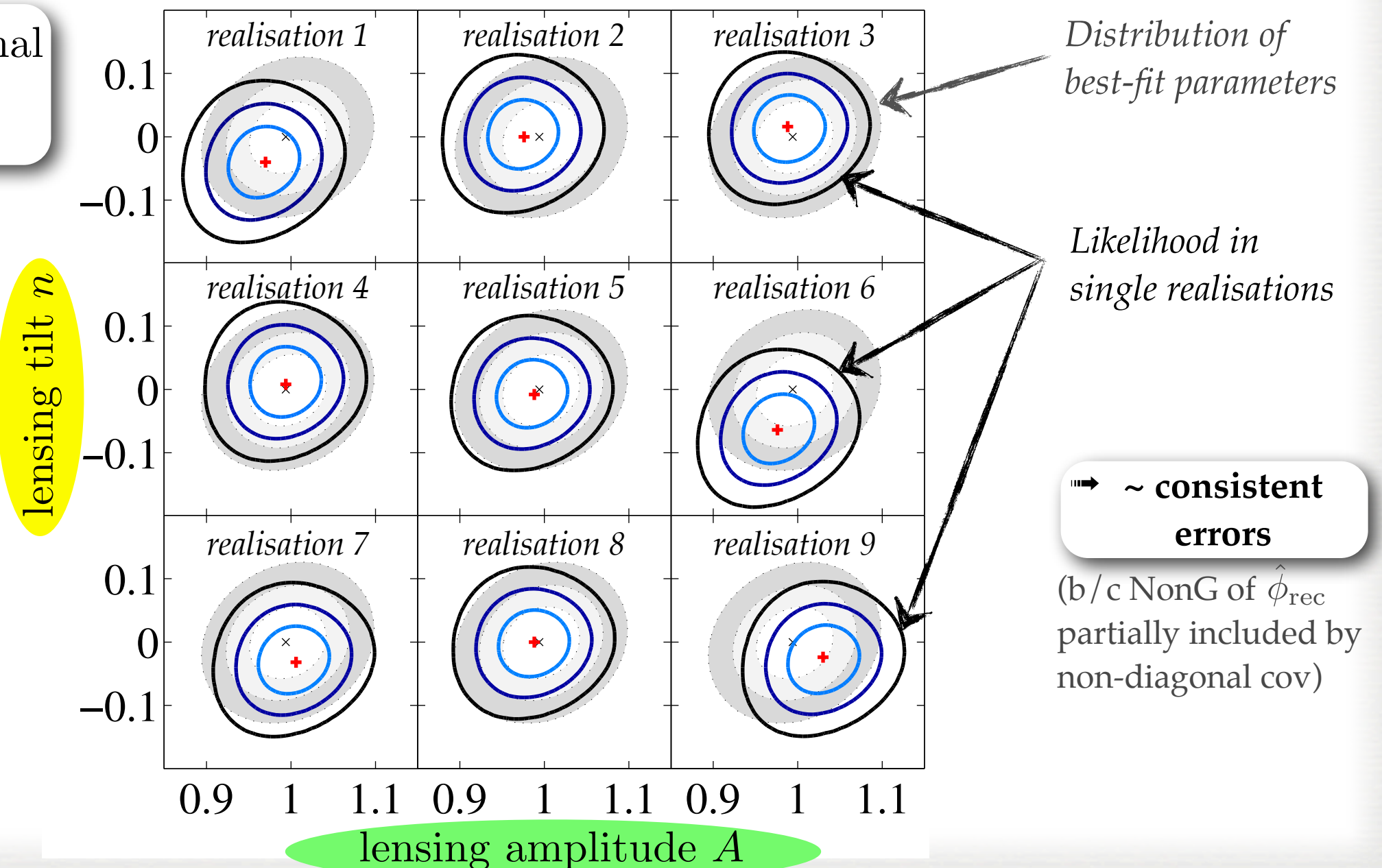
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$\mathcal{L}_2$  with *non*-diagonal  
 $\text{cov}(\hat{C}_L^{\phi\phi}, \hat{C}_{L'}^{\phi\phi})$



# CMB LENSING RECONSTRUCTION

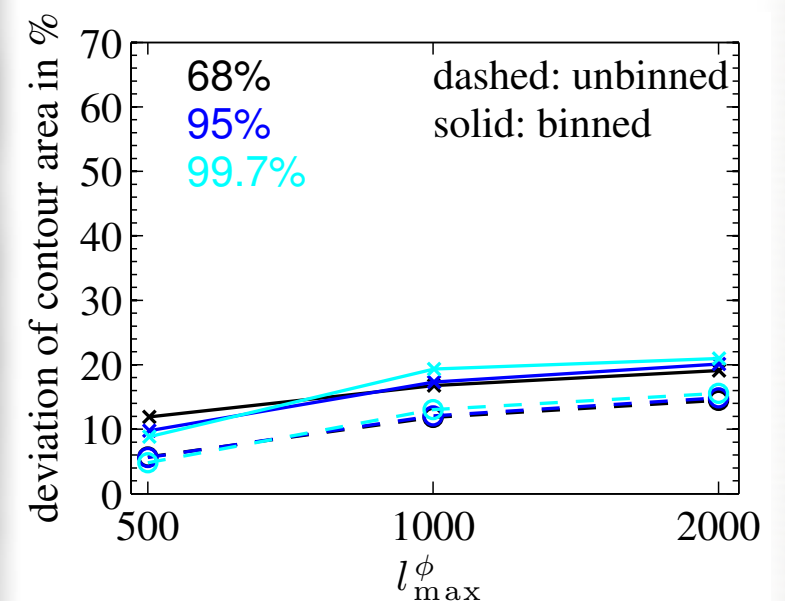
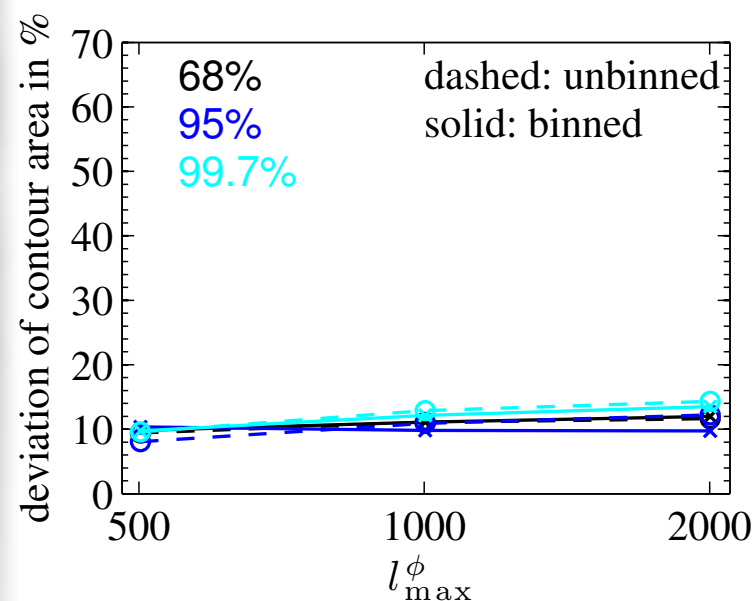
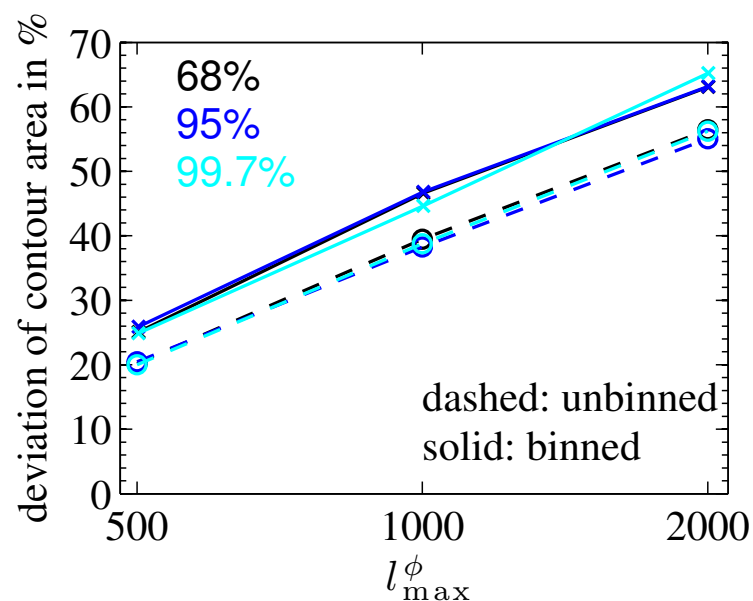
## LIKELIHOOD TESTS: QUANTITATIVELY

$\mathcal{L}_2$  with *diagonal*  
 $\text{cov}(\hat{C}_L^{\hat{\phi}\hat{\phi}}, \hat{C}_{L'}^{\hat{\phi}\hat{\phi}})$

$\mathcal{L}_2$  with *non-diagonal*  
 $\text{cov}(\hat{C}_L^{\hat{\phi}\hat{\phi}}, \hat{C}_{L'}^{\hat{\phi}\hat{\phi}})$

$\mathcal{L}_2$  with *diagonal*  
 $\text{cov}(\hat{C}_L^{\hat{\phi}\hat{\phi}}, \hat{C}_{L'}^{\hat{\phi}\hat{\phi}})$   
 and realisation-dep.  $\hat{N}^{(0)}$

*Deviation of areas of confidence ellipses*



*Fractional error of marginalised error bars of  $A$  or  $n$ :  $\sim (\text{area dev.})/2$*

$\sim 34\%$

$\sim 8\%$

$\sim 11\%$

$\Rightarrow \mathcal{L}_2$  is accurate likelihood approximation if non-diagonal  $\text{cov}(\hat{C}_L^{\hat{\phi}\hat{\phi}}, \hat{C}_{L'}^{\hat{\phi}\hat{\phi}})$  or  $\hat{N}^{(0)}$  is used



# CONCLUSIONS

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- Understand non-Gaussianity of  $\phi_{\text{rec}}$  and correlation with temperature analytically

$$\text{cov}(\hat{C}_{L_\phi}^{\phi_{\text{rec}}\phi_{\text{rec}}}, \hat{C}_{L_T, \text{expt}}^{\tilde{T}\tilde{T}}) = \underbrace{\frac{\partial(2\hat{N}_{L_\phi}^{(0)})}{\partial \hat{C}_{L_T, \text{expt}}^{\tilde{T}\tilde{T}}} \frac{2}{2L_T + 1} \left(C_{L_T, \text{expt}}^{\tilde{T}\tilde{T}}\right)^2}_{\text{noise contribution (disconnected 6-point)}} \left[ \underbrace{1 + 2 \frac{C_{L_\phi}^{\phi\phi}}{A_{L_\phi}}}_{\text{connected 4-point}} \right] + \underbrace{\frac{2}{2L_\phi + 1} \left(C_{L_\phi}^{\phi\phi}\right)^2 \frac{\partial C_{L_T}^{\tilde{T}\tilde{T}}}{\partial C_{L_\phi}^{\phi\phi}}}_{\text{matter cosmic variance (connected 6-point)}}$$

- Found methods to treat/mitigate both
- This has significantly simplified joint analysis of  $C^{\tilde{T}\tilde{T}}$  and  $\phi_{\text{rec}}$  for Planck:

no cross-term!

⇒ Likelihoods can be modeled separately,  $\ln \mathcal{L}(C^{\tilde{T}\tilde{T}}, \phi_{\text{rec}}) = \ln \mathcal{L}(C^{\tilde{T}\tilde{T}}) + \ln \mathcal{L}_2(\phi_{\text{rec}})$

⇒ Non-Gaussianity of  $\phi_{\text{rec}}$  modeled by likelihood that's Gaussian in  $\hat{C}^{\phi_{\text{rec}}\phi_{\text{rec}}}$

Thanks